

**A MODIFIED TECHNIQUE IN RFID NETWORKING PLANNING AND  
OPTIMIZATION**

AZLI BIN NAWAWI

A thesis submitted in  
fulfillment of the requirement for the award of the  
Doctor of Philosophy



Faculty of Mechanical and Manufacturing Engineering  
Universiti Tun Hussein Onn Malaysia

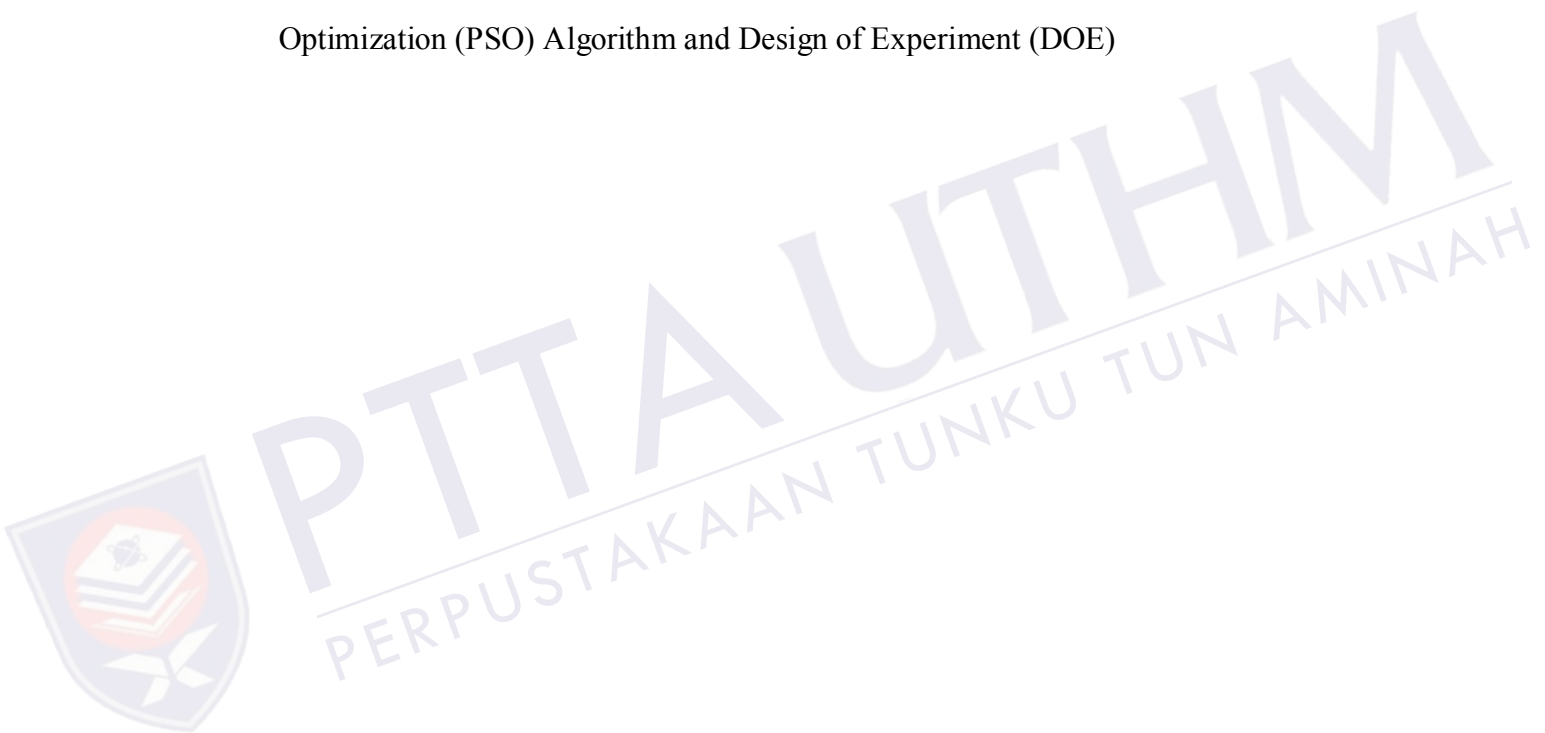
JANUARY 2015

## ABSTRACT

Radio Frequency Identification (RFID) system is acknowledged as a mature technology often deployed in large scale tracking applications. Implementation issues like cost and effectiveness necessitated research on RFID Network Planning (RNP). The solution typically inspired by nature includes the use of Genetic Algorithm (GA), Bacteria Foraging Optimization (BFO) and Particle Swarm Optimization (PSO) Algorithm. In this research, PSO algorithm was used in the optimization process as it was considered as a very useful, efficient and well known algorithm. However, there are no parameters settings of PSO that fits all. This issue becomes more significant if PSO is used for solving complex optimization problem such as the RFID Network Planning (RNP). Any variation made to the values of PSO parameters (number of iterations, number of swarms, inertia weight value and correction factor value) will result in a huge difference to the output of the optimization process. In addition, RFID tag coverage optimization comes with another set of parameters to be considered such as the number of RFID readers, number of RFID tags and working space area. RFID tag coverage optimization is also considered as a high dimensional optimization process. To reduce the complexity of the optimization process, this research focuses on developing a method to determine the optimum setting for PSO parameters. Two sessions of Design of Experiment (DOE) analysis were embedded in the optimization process. Initially, the objective function was developed by elaborating the mathematical model of RFID tag coverage optimization. In order to get the general settings of PSO parameters, several RNP scenarios were generated by the first session of DOE and a Matlab code was developed for each scenario. For the second session of DOE, the results from the PSO optimization of each RNP scenario were analyzed using Minitab 16 software and the optimum settings of PSO parameters were identified. From here, the general settings of PSO parameters that can be applied to all scenarios are proposed. For the purpose of validation, the RFID tag coverage optimization

using PSO and DOE combinations was tested against two variants of PSO. The comparison tests were done for all RNP scenarios and from the experiment results, the combination of PSO and DOE manages to perform better compared to other PSO variants in the test of objective function value eventhough not the fastest. As a conclusion, the proposed method (PSO and DOE combination) can be considered as a robust and efficient optimization system because it manages to generate high quality results in overall RNP scenarios. Additionally, the spread of the generated results is small.

Keywords: RFID Network Planning, RFID Tag Coverage, Particle Swarm Optimization (PSO) Algorithm and Design of Experiment (DOE)



## ABSTRAK

Sistem *Radio Frequency Identification* (RFID) kini dianggap sebagai teknologi yang matang dan ia sering digunakan dalam aplikasi berskala besar. Senario ini mengakibatkan masalah Perancangan Rangkaian RFID (RNP) yang semakin menular dan algoritma yang diilhamkan dari alam semulajadi (*Genetic Algorithm* (GA), *Bacteria Foraging Optimization* (BFO) dan *Particle Swarm Optimization* (PSO)) sering digunakan untuk menyelesaikan masalah RNP ini. Dalam kajian ini, algoritma PSO telah digunakan dalam proses pengoptimuman kerana algoritma ini cekap, efisien dan terkenal. Walaubagaimanapun, PSO tidak mempunyai penetapan parameter optimum yang sesuai untuk semua masalah pengoptimuman. Hal ini menjadi lebih kritikal jika PSO digunakan untuk masalah pengoptimuman yang kompleks seperti RNP kerana sebarang perubahan nilai yang kecil pada parameter-parameter PSO akan menghasilkan keputusan yang berbeza-beza. Selain parameter-parameter PSO (bilangan ulangan (*iterations*), bilangan kawanan (*swarms*), nilai *inertia weight* dan nilai *correction factor*), RNP juga mempunyai beberapa parameter yang perlu diambil kira seperti bilangan alat pembaca, bilangan tag dan luas kawasan kerja. Selain itu, RNP juga dikategorikan sebagai masalah pengoptimuman kompleks dan berdimensi tinggi. Oleh itu, kajian ini bertujuan untuk membangunkan sebuah kaedah untuk mendapatkan penetapan (*setting*) yang umum bagi setiap parameter PSO bagi proses pengoptimuman liputan tag RFID. Dalam kaedah ini, dua sesi *Design of Experiment* (DOE) akan digunakan dalam proses pengoptimuman ini. Untuk permulaan, fungsi objektif perlu dibentuk dengan menghuraikan model matematik bagi liputan tag RFID. Proses penghuraian ini penting bagi mendedahkan kesemua lokasi parameter RNP supaya fungsi objektif berkenaan boleh digunakan untuk proses pengoptimuman PSO. Bagi menjana penetapan yang umum, kajian ini mengambil kira beberapa senario RNP untuk dikaji dan kumpulan senario ini dijana menggunakan sesi pertama DOE. Kemudian, kod Matlab untuk proses pengoptimuman setiap senario dibangunkan. Seterusnya, untuk sesi kedua DOE,

keputusan yang dijana oleh proses pengoptimuman untuk setiap senario RNP akan dianalisa menggunakan perisian Minitab 16. Dalam sesi kedua DOE ini, penetapan optimum untuk setiap parameter PSO bagi setiap senario akan diketahui. Dari sini, penetapan umum bagi setiap parameter PSO juga telah diutarakan. Bagi proses validasi, proses pengoptimuman liputan tag RFID dengan penetapan parameter optimum (kombinasi PSO dan DOE) telah diuji dengan beberapa varian PSO yang lain. Hasil dari keputusan eksperimen, didapati kaedah pengoptimuman menggunakan gabungan PSO dan DOE berjaya menjana keputusan yang lebih baik bagi nilai fungsi objektif untuk setiap senario RNP walaupun bukan dalam masa yang terpantas. Kesimpulannya, kaedah pengoptimuman yang menggunakan kombinasi PSO dan DOE adalah cekap dan efisien kerana kaedah ini berpotensi untuk menjana keputusan-keputusan yang berkualiti tinggi bagi kesemua senario RNP. Selain itu, keputusan-keputusan yang dijana juga berada dalam julat yang rendah.

Kata kunci: Perancangan Rangkaian RFID (RNP), Liputan Tag RFID, Algoritma *Particle Swarm Optimization* (PSO) Algorithm and *Design of Experiment* (DOE)



## CONTENTS

<b>TITLE</b>	<b>i</b>
<b>DECLARATION</b>	<b>ii</b>
<b>DEDICATION</b>	<b>iii</b>
<b>ACKNOWLEDGEMENT</b>	<b>iv</b>
<b>ABSTRACT</b>	<b>v</b>
<b>ABSTRAK</b>	<b>vii</b>
<b>CONTENTS</b>	<b>ix</b>
<b>LIST OF TABLES</b>	<b>xv</b>
<b>LIST OF FIGURES</b>	<b>xvii</b>
<b>LIST OF SYMBOLS AND ABBREVIATIONS</b>	<b>xxiii</b>
<b>CHAPTER 1 INTRODUCTION</b>	<b>1</b>
1.1 Challenges of Large Scale RFID Deployment	2
1.2 Parameter Tuning Weakness of PSO Algorithm	4
1.3 Research Objectives	5
1.4 Research Scopes	S6
1.5 Thesis Organization	8
<b>CHAPTER 2 LITERATURE REVIEW</b>	<b>9</b>
2.1 Introduction to Cellular Network	9

2.2 Cellular Network Planning	11
2.2.1 The Importance of Cellular Network Planning	14
2.2.2 The Relation between Cellular Network and RFID Technology	15
2.3 Radio Frequency Identification (RFID) System	18
2.3.1 RFID Equipments	18
2.4 The Horizon of RFID Technology	22
2.5 RFID Applications	25
2.5.1 RFID Application in Asset Tracking and Management	28
2.6 RFID Network Planning	31
2.6.1 Trends in RNP	32
2.6.2 Tag Coverage	35
2.6.3 Reader Interference	36
2.6.4 RFID Tag Coverage Optimization	38
2.7 Particle Swarm Optimization (PSO) Algorithm	41
2.7.1 Advantages of Particle Swarm Optimization	44
2.7.2 Disadvantages of Particle Swarm Optimization	45
2.7.3 Applications of Particle Swarm Optimization	46
2.8 Related Works	49
2.8.1 Solving RNP using PSO Algorithm	49
2.8.2 Parameter Tuning of PSO Algorithm	54

2.8.3 Design of Experiments (DOE) Implementations	56
2.9 Summary	59

## **CHAPTER 3 RESEARCH METHODOLOGY 62**

3.1 Network Planning and Optimization Methodology	62
3.2 Preparation of RFID Tag Coverage Objective Function	63
3.3 Parameter Tuning of PSO	65
3.4 Performance Comparison against Other PSO Variants	68
3.5 Research Design	69
3.6 Summary	72

## **CHAPTER 4 CORRELATION BETWEEN RFID NETWORK PLANNING (RNP) PARAMETERS AND PSO SOLUTIONS 74**

4.1. Identification and Elaboration of RFID Tag Coverage Optimization Objective Function	76
4.1.1 Identification of Established Mathematical Model	76
4.1.2 Identification of RFID System Parameters	77
4.1.3 Exposing RFID System Parameters in Optimal Tag Coverage Objective Function	77
4.1.4 Identification of the Dimensions for PSO Solutions	81
4.1.5 Identification of Representation System for PSO Solutions	81



4.2 PSO Code Development in Matlab Environment	83
4.2.1 Preparing Pseudocode for PSO Algorithm	83
4.2.2 Coding PSO in Matlab Environment	84
4.2.3 Defining Working Area	85
4.2.4 Plotting a Graph in Matlab	86
4.2.5 Generating Random Numbers According to PSO Requirements	90
4.2.6 Running PSO in Matlab	93
4.2.7 Script and Function m-files in Matlab	94
4.2.8 Saving a File in Matlab	95
4.2.9 Embedding the Elaborated Objective Function into PSO Code	95
4.3 Verification of Matlab Code	97
4.4 Summary	98

## **CHAPTER 5 ESTABLISHMENT OF RNP SCENARIOS AND DEVELOPMENT OF PSO-DOE INTEGRATION**

5.1 Generating RNP Scenarios using DOE	101
5.2 RNP Scenarios Generated using DOE	102
5.3 Performing DOE Analysis on PSO results	108
5.3.1 Identification of Responses for DOE Analysis	111
5.3.2 Identification of Factors for DOE Analysis	112
5.3.3 Performing Experimental Design	113

5.3.4 Identification of Significance Parameters and Quantitative Effect and Optimum Setting for Each Parameter	118
5.4 Optimum and General Settings of PSO Parameters	122
5.4.1 Pareto Chart of the Effects	123
5.4.2 Normal Plot of the Effects	129
5.4.3 Main Effects Plot and Optimum Settings of PSO Parameters	136
5.4.4 General Settings of PSO Parameters	147
5.5 Summary	149
<b>CHAPTER 6 RESULTS OF PERFORMANCE COMPARISON IN RNP ENVIRONMENT</b>	<b>151</b>
6.1 Performance Comparison as the Validation Process	151
6.2 Performance Comparison against Other PSO Variants	155
6.2.1 Objective Function Value as Response	156
6.2.2 Simulation Runtime as Response	170
6.3 Summary	182
<b>CHAPTER 7 CONCLUSION AND RECOMMENDATION</b>	<b>183</b>
7.1 Conclusion	183
7.2 Contributions	186
7.2.1 Objective Function of RFID Tag Coverage Optimization	187

7.2.2 PSO and DOE Integration	187
7.2.3 Performance Comparison against Other PSO Variants	188
7.3 Recommendations for Future Works	188
<b>REFERENCES</b>	<b>191</b>
<b>APPENDIX</b>	<b>205</b>
<b>VITA</b>	<b>245</b>



## LIST OF TABLES

Table 1.1: Name and range for each parameter	7
Table 2.1: The generations of cellular network	10
Table 2.2: RNP objectives from previous researches	32
Table 2.3: Application of PSO for solving RNP in previous researches	40
Table 2.4: Applications of PSO from 1995 to 2014	46
Table 2.5: Previous researches related to RNP optimization using PSO algorithm	50
Table 2.6: The application of DOE for PSO parameter tuning	55
Table 2.7: List of related researches	57
Table 3.1: The minimum and maximum setting of each testing parameter	67
Table 4.1: The measuring unit for each RFID system parameter	77
Table 4.2: Representation of PSO solution	82
Table 4.3: Representation of PSO solution	82
Table 4.4: Matlab generated random numbers for readers' coordinates	91
Table 4.5: Random numbers for 3 readers and 5 particles	92
Table 4.6: Microsoft Excel template for verifying the PSO codes	98
Table 5.1: The lower and upper range of each RNP parameter for performance comparison test	100
Table 5.2: Factors used for generating RNP scenarios using DOE	101
Table 5.3: Measurement unit used for each response	112
Table 5.4: List of factors for each DOE analysis	112
Table 5.5: List of factors to be investigated using Minitab 16	115

Table 5.6: Optimum setting for each PSO parameter for Scenario 1	137
Table 5.7: Optimum setting for each PSO parameter for Scenario 2 (Objective function value)	139
Table 5.8: Optimum setting for each PSO parameter for Scenario 3 (Objective function value)	140
Table 5.9: Optimum setting for each PSO parameter for Scenario 4 (Objective function value)	141
Table 5.10: Optimum setting for each PSO parameter for Scenario 5 (Objective function value)	143
Table 5.11: Optimum setting for each PSO parameter for Scenario 1 (Objective function value)	144
Table 5.12: Optimum setting for each PSO parameter for Scenario 7 (Objective function value)	146
Table 5.13: Optimum setting for each PSO parameter for Scenario 8 (Objective function value)	147
Table 5.14: Optimum settings for PSO parameters (Objective function value)	148
Table 5.15: The general setting of PSO parameter for solving RFID tag coverage optimization (Objective function value)	149
Table 6.1: Settings for PSO parameters for each variant of PSO used in Objective 3	153

## LIST OF FIGURES

Figure 2.1: Various types of methods are available for cellular network planning (Laiho and Wacker, 2001; Laiho, Wacker, and Novosad, 2006; Mishra, 2004)	12
Figure 2.2: The Electromagnetic Spectrum (LASP)	17
Figure 2.3: RFID System Components (Elshayeb, Hasnan, and Yen, 2009)	19
Figure 2.4: Classification of RFID Readers (Karmakar, 2010)	21
Figure 2.5: Flexible antenna RFID tags and crew bag with tagged items inside (P. Brown, <i>et al.</i> , 2007)	26
Figure 2.6: NASA version of RF SAW Model 704 Reader (shown with PDA) (P. Brown, <i>et al.</i> , 2007)	27
Figure 2.7: Publications related to PSO per year (Scholar, 2014)	44
Figure 2.8: General methodology for performing RNP optimization (Hanning Chen and Yunlong Zhu, 2008; Chen, <i>et al.</i> , 2011; Y.-J. Gong, <i>et al.</i> , 2012; Guan, <i>et al.</i> , 2006)	54
Figure 2.9: The generic method for performing DOE analysis	59
Figure 3.1: A generic network planning diagram	63
Figure 3.2: Stages for preparing the objective function and the codes	65
Figure 3.3: DOE is used for defining the parameter tuning of PSO	66
Figure 3.4: 2 DOE sessions were proposed to perform the parameter tuning for all RNP scenarios within the scopes	68
Figure 3.5: The performance comparison stage	69
Figure 3.6: Overall research flowchart	71

Figure 4.1: Methodology flowchart for the first research objective (Identification and elaboration of RFID tag coverage optimization objective function)	75
Figure 4.2: Radiation pattern of an isotropic radiator	78
Figure 4.3: Working area for RNP: 30m x 30m and 100 RFID tags scattered randomly	85
Figure 4.4: A graph showing locations of 100 tags in the working area of 1m x 1m	87
Figure 4.5: Locations of 100 randomly distributed tags in a 30m x 30m working area	88
Figure 4.6: 100 tags and 10 readers in the same graph (working area)	90
Figure 5.1: RNP scenarios generated by the first session of DOE	101
Figure 5.2: Scenario 1 (1 Reader, 100 Tags and 5m x 5m Working Space Area). The unit of the X and Y axis is Centimeter (cm)	102
Figure 5.3: Scenario 2 (10 Reader, 10 Tags and 30m x 30m Working Space Area). The unit of the X and Y axis is Centimeter (cm)	103
Figure 5.4: Scenario 3 (1 Reader, 10 Tags and 5m x 5m Working Space Area). The unit of the X and Y axis is Centimeter (cm)	104
Figure 5.5: Scenario 4 (1 Reader, 10 Tags and 30m x 30m Working Space Area). The unit of the X and Y axis is Centimeter (cm)	105
Figure 5.6: Scenario 5 (10 Readers, 100 Tags and 30m x 30m Working Space Area). The unit of the X and Y axis is Centimeter (cm)	106
Figure 5.7: Scenario 6 (10 Readers, 10 Tags and 5m x 5m Working Space Area). The unit of the X and Y axis is Centimeter (cm)	107

Figure 5.8: Scenario 7 (10 Readers, 100 Tags and 5m x 5m Working Space Area). The unit of the X and Y axis is Centimeter (cm)	107
Figure 5.9: Scenario 8 (1 Reader, 100 Tags and 30m x 30m Working Space Area). The unit of the X and Y axis is Centimeter (cm)	108
Figure 5.10: Methodology flowchart for the integration of PSO and DOE	110
Figure 5.11: Initial step for creating factorial design in Minitab 16	114
Figure 5.12: GUI for selecting the type of design and setting the number of factors	115
Figure 5.13: Design catalog from Minitab 16	116
Figure 5.14: GUI for choosing the design of experiment (Full factorial is chosen in the figure)	117
Figure 5.15: GUI for entering the name and levels for each factor	117
Figure 5.16: An example of Pareto chart generated by Minitab software	119
Figure 5.17: An example of normal effects plot chart generated by Minitab software	120
Figure 5.18: An example of main effects plot generated by Minitab software	121
Figure 5.19: An example of interaction plot chart generated by Minitab software	122
Figure 5.20: Pareto chart for the objective function value of Scenario 1	123
Figure 5.21: Pareto chart for the objective function value of Scenario 2	124
Figure 5.22: Pareto chart for the objective function value of Scenario 3	125
Figure 5.23: Pareto chart for the objective function value of Scenario 4	126
Figure 5.24: Pareto chart for the objective function value of Scenario 5	127
Figure 5.25: Pareto chart for the objective function value of Scenario 6	127
Figure 5.26: Pareto chart for the objective function value of Scenario 7	128



Figure 5.27: Pareto chart for the objective function value of Scenario 8	129
Figure 5.28: Normal plot effects for the objective function value of Scenario 1	129
Figure 5.29: Normal plot effects for the objective function value of Scenario 2	130
Figure 5.30: Normal plot effects for the objective function value of Scenario 3	131
Figure 5.31: Normal plot effects for the objective function value of Scenario 4	132
Figure 5.32: Normal plot effects for the objective function value of Scenario 5	133
Figure 5.33: Normal plot effects for the objective function value of Scenario 6	134
Figure 5.34: Normal plot effects for the objective function value of Scenario 7	135
Figure 5.35: Normal plot effects for the objective function value of Scenario 8	136
Figure 5.36: Main effects plot for the objective function value of Scenario 1	136
Figure 5.37: Main effects plot for the objective function value of Scenario 2	138
Figure 5.38: Main effects plot for the objective function value of Scenario 3	140
Figure 5.39: Main effects plot for the objective function value of Scenario 4	141
Figure 5.40: Main effects plot for the objective function value of Scenario 5	142
Figure 5.41: Main effects plot for the objective function value of Scenario 6	144
Figure 5.42: Main effects plot for the objective function value of Scenario 7	145

Figure 5.43: Main effects plot for the objective function value of Scenario 8	146
Figure 6.1: Methodology flowchart for the performance comparison between PSO and DOE combination with other variants of PSO)	152
Figure 6.2: An example of individual value plot generated by Minitab software	154
Figure 6.3: An example of Boxplot chart generated by Minitab software	155
Figure 6.4: Individual value plot for the objective function value of Scenario 1	157
Figure 6.5: Boxplot for the objective function value of Scenario 1	157
Figure 6.6: Individual value plot for the objective function value of Scenario 2	158
Figure 6.7: Boxplot for the objective function value of Scenario 2	159
Figure 6.8: Individual value plot for the objective function value of Scenario 3	160
Figure 6.9: Boxplot for the objective function value of Scenario 3	161
Figure 6.10: Individual value plot for the objective function value of Scenario 4	162
Figure 6.11: Boxplot for the objective function value of Scenario 4	163
Figure 6.12: Individual value plot for the objective function value of Scenario 5	164
Figure 6.13: Boxplot for the objective function value of Scenario 5	164
Figure 6.14: Individual value plot for the objective function value of Scenario 6	165
Figure 6.15: Boxplot for the objective function value of Scenario 6	166
Figure 6.16: Individual value plot for the objective function value of Scenario 7	167
Figure 6.17: Boxplot for the objective function value of Scenario 7	167

Figure 6.18: Individual value plot for the objective function value of Scenario 8	168
Figure 6.19: Boxplot for the objective function value of Scenario 8	169
Figure 6.20: Individual value plot for the simulation runtime of Scenario 1	170
Figure 6.21: Boxplot for the simulation runtime of Scenario 1	171
Figure 6.22: Individual value plot for the simulation runtime of Scenario 2	172
Figure 6.23: Boxplot for the simulation runtime of Scenario 2	172
Figure 6.24: Individual value plot for the simulation runtime of Scenario 3	173
Figure 6.25: Boxplot for the simulation runtime of Scenario 3	173
Figure 6.26: Individual value plot for the simulation runtime of Scenario 4	174
Figure 6.27: Boxplot for the simulation runtime of Scenario 4	175
Figure 6.28: Individual value plot for the simulation runtime of Scenario 5	176
Figure 6.29: Boxplot for the simulation runtime of Scenario 5	177
Figure 6.30: Individual value plot for the simulation runtime of Scenario 6	178
Figure 6.31: Boxplot for the simulation runtime of Scenario 6	179
Figure 6.32: Individual value plot for the simulation runtime of Scenario 7	180
Figure 6.33: Boxplot for the simulation runtime of Scenario 7	180
Figure 6.34: Individual value plot for the simulation runtime of Scenario 8	181
Figure 6.35: Boxplot for the simulation runtime of Scenario 8	181
Figure 7.1: Implementation of 2 DOE sessions on the RFID tag coverage optimization using PSO algorithm	185

## LIST OF SYMBOLS AND ABBREVIATIONS

<i>RFID</i>	-	Radio Frequency Identification
<i>RNP</i>	-	RFID Network Planning
<i>PSO</i>	-	Particle Swarm Optimization
<i>DOE</i>	-	Design of Experiments
<i>GA</i>	-	Genetic Algorithm
<i>UTHM</i>	-	Universiti Tun Hussein Onn Malaysia
<i>ANN</i>	-	Artificial Neural Networks
<i>DE</i>	-	Differential Evolution
<i>IT</i>	-	Information Technology
<i>ISS</i>	-	International Space Station
<i>SAW</i>	-	Surface Acoustic Waves
<i>GPS</i>	-	Global Positioning System
<i>QoS</i>	-	Quality of Service
<i>IDENTEC</i>	-	An RFID solution provider
<i>SDK</i>	-	Software Development Kit
<i>RGA</i>	-	Real-code Genetic Algorithm
<i>ES</i>	-	Evolution Strategy
<i>SA-ES</i>	-	Self Adaptation Evolution Strategy
<i>CPSO</i>	-	Canonical Particle Swarm Optimization
<i>MCPSO</i>	-	Multi-swarm Cooperative Particle Optimization
<i>MC-BFO</i>	-	Multi-colony Bacteria Foraging Optimization
<i>MGA</i>	-	Modifies Genetic Algorithm

$P_t$	- Transmitted (reader) power
$G_t$	- Transmitter(reader) antenna gain
$G_r$	- Receiver (tag) antenna gain
$D$	- Distance between transmitter and receiver
$\lambda$	- Radio wavelength
$N_T$	- Number of tags
$P_i^r$	- Received power at each tag (dBm)
$P_d$	- Threshold power (minimum power to start communication) (dBm)
$dBi$	- Comparison between antenna gain and isotropic radiator
$dBd$	- Comparison between antenna gain and reference dipole
$\alpha_{BW}$	- Spectrum power
$E_{tag}$	- Tag effective power reflection coefficient
$P_{TX}$	- Transmitter (tag) transmit power
$G_T$	- Transmitter (tag) antenna gain
$G_R$	- Receiver (reader) antenna gain
$PL(x)$	- Path-loss for the distance between reader and tag
$M$	- Number of readers
$dist( )$	- Function to compute distance
$R_i, R_j$	- Positions of $i$ th and $j$ th reader respectively
$r_i, r_j$	- Interference range of $i$ th and $j$ th reader respectively
$\gamma(p)$	- Readers interference at point $p$
$RT$	- All tag read test points in the working area
$Cd_{r,p}$	- Signal strength at receiver (tag) from the desired reader
$Cd_{rj,p}$	- Signal strength at receiver (tag) from other reader, Reader $j$
$S_m$	- Sensitivity threshold
$v(t + 1)$	- New velocity
$w$	- Inertia weight

$v(t)$	-	Current velocity
$R$	-	Random variable (0 to 1)
$c_1$	-	Cognitive weight
$p(t)$	-	Personal best known position
$x(t)$	-	Current position
$c_2$	-	Social weight
$g(t)$	-	Global best known position
$x(t + 1)$	-	New position
AMPS	-	Advanced Mobile Phone System
FDMA	-	Frequency Division Multiple Access
Mobitex	-	A wireless network architecture
DataTAC	-	A wireless data network technology
NMT	-	Nordic Mobile Telephone
TACS	-	Total Access Communication System
CDMA	-	Code Division Multiple Access
GSM	-	Global System for Mobile Communication
IDEN	-	Integrated Digital Enhanced Network
PCS	-	Personal Communication Service
TDMA	-	Time Division Multiple Access
GPRS	-	General Packet Radio Service
HSCSD	-	High-Speed Circuit-Switched Data
EDGE	-	Enhanced Data for Global Evolution
WiDEN	-	Wideband Integrated Digital Enhanced Network
UMTS	-	Universal Mobile Telecommunications System
WCDMA	-	Wideband Code Division Multiple Access
LTE	-	Long Term Evolution
WiMAX	-	Worldwide Interoperability for Microwave Access

## CHAPTER 1

### INTRODUCTION

RFID is very magical. These words were quoted from Dr. Bill Hardgrave, the founder of the RFID Research Center at the University of Arkansas. The center had a strong collaboration with Wal-Mart, the first company to implement RFID in a large scale. Dr. Hardgrave strongly believes that RFID will be used during the direct checkout of any retailer and the customers can do the purchase with using only the mobile phones or kiosks (Bustillo, 2010; Delen, Sharda, and Hardgrave, 2011).

Fortunately, his vision managed to become a reality in various retailers located in the United States of America and some European countries. Additionally, RFID is also widely used in the supply chain and production processes in various industries (S. A. Ahson and Ilyas, 2010; Bolic, Simplot-Ryl, and Stojmenovic, 2010).

The application of RFID technology in the supply chain was steadily increased and the need to detect assets in a large area is becoming essential. This scenario applies in the automated inventory management system and product receiving (Qiang, Yu, Yiping, and Wenshneg, 2006). The increasing trend of RFID deployment is due to the reduced cost of the equipments and the established global standard that applies to most RFID systems. This is the result from years of extensive researches.

RFID system is very excellent for various applications in the manufacturing industry such as for tracking work in progress (WIP), eliminating bottlenecks, tracking finished goods and measuring the inventory level. In automotive related systems, RFID technology serves as the main component in the engine immobilization system. In the supply chain management (SCM) industry, RFID

system can be used in various processes such as shipping and receiving, warehousing, retail outlet and inventory management. As for the inventory management, RFID system is deployed for the asset recall and return management. In addition, RFID system is also deployed by airline industries for tracking baggage (Brown, Patadia, and Dua, 2007). From here, it can be concluded that the statement from Dr. Hardgrave is true.

### 1.1 Challenges of Large Scale RFID Deployment

An increasing number of companies start to deploy RFID technology in a large scale. This is a sign that the cost of RFID technology has become more affordable for most companies. After years of RFID industrial debut, the cost of passive tag is continuously decreased and fall into the 'comfort zone' of many companies and firms. In addition, the sensitivity of the chip in the RFID tag is also improving. After years of technological enhancement, RFID technology offers a much better coverage and enhanced readability. One example of a large scale RFID success story is the METRO Group (S. A. Ahson and Ilyas, 2010; Polycarpou, *et al.*, 2012). Upon deploying the RFID system, this company enjoyed various benefits such as the reduction in labor, time savings, efficient handling process and reducing out-of-stock (Polycarpou, *et al.*, 2012).

RFID technology is an established technology and the equipments of RFID are mostly ready for industrial applications. To deploy this technology in a small scale is relatively simple because the complexity of the system is still at the 'manageable' level. However, as mentioned before, most corporations and companies tend to deploy the system in a large scale. This means that the number of RFID equipments (reader, tag, antenna, middleware and others) is relatively huge. In other words, the complexity of the RFID system is increasing because of the significant needs for deploying a huge number of RFID readers without issues.

Additionally, the detection range for an RFID system is relatively limited for the time being. As a result, more RFID readers are needed in order to cover a large area. There are also some challenges that need to be considered such as the optimal



tag coverage, readers collision avoidance, cost efficiency and good load balance (Ben, Wong, Yujuan, and Li, 2009; I. Bhattacharya and U.K. Roy, 2010; H. Chen and Y. Zhu, 2008; Chen, Zhu, and Hu, 2010; Chen, Zhu, Hu, and Ku, 2011; Di Giampaolo, Forni, and Marrocco, 2010; Y. Gong, Shen, Zhang, Chen, and Zhan, 2011; Leong, Ng, and Cole, 2005, 2006; Lin and Lin, 2007; Qiang, *et al.*, 2006; Yahui, Yujie, Min, and Zhijing, 2009). These challenges formed a new branch of knowledge named RFID Network Planning (RNP). RNP is very crucial before deploying an RFID system because RNP focuses on solving the challenges mentioned above.

A good RNP solution will optimize the RFID system and minimize the system interference to other RF systems in the surroundings (Leong, *et al.*, 2006). It will also ensure an acceptable Quality of Service (QoS) by minimizing the interference between RFID readers (Qiang, *et al.*, 2006). According to Chen, Zhu *et al* (2010), RNP problems need to be solved before installing RFID system in order to make sure the system operate optimally.

From the literature, RNP is a multi objective optimization function and the solution is in the form of the best location and power setting for each reader. As a result, in order to determine the best locations for readers those satisfy RNP challenges mentioned above, Nature Inspired Algorithms were employed (Genetic Algorithm, Bacteria Foraging Algorithm and Particle Swarm Optimization Algorithm) (Indrajit Bhattacharya and Uttam Kumar Roy, 2010).

In this research, Particle Swarm Optimization (PSO) was chosen as the base platform for solving RNP challenges (problems). This research focuses on the first RNP objective mentioned above (Optimal tag coverage). The reason for choosing RFID tag coverage is due to the fact that this objective is the most crucial among other RNP objectives (Di Giampaolo, *et al.*, 2010; Guan, Liu, Yang, and Yu, 2006).

## 1.2 Parameter Tuning Weakness of PSO Algorithm

PSO algorithm is an optimization technique that is based on a population system. This algorithm is inspired by the movement of birds and fishes in their own groups (Kennedy and Eberhart, 1995).

PSO also owns several advantages compared to Genetic Algorithm (GA) such as faster speed, easier to implement and fewer parameters to be adjusted (Chamaani, Mirtaheri, Teshnehlal, and Shooredeli, 2007; Khare and Rangnekar, 2012; Mei-Ping and Guo-Chang, 2004). According to Eberhart (2001), PSO is also considered as conceptually simple, easy to use and effectively works on various optimization problems (Eberhart, Shi, and Kennedy, 2001). PSO is also easy to modify/alter in order to fulfill different needs. This is due to the less number of parameters to be considered.

Although PSO is considered as an established optimization algorithm, it does not have the parameter tuning that fits all optimization problems. The PSO's parameters that require a proper tuning are the number of iterations, number of swarms, inertia weight value and correction factor value (El-Gallad, El-Hawary, Sallam, and Kalas, 2002; Kramer, Gloger, and Goebels, 2007). In some optimization problem, these parameters need to be set to the optimum value in order to get the best result (Beielstein, Parsopoulos, and Vrahatis, 2002).

The issue of parameter tuning weakness will worsen if PSO is used to optimize the RFID tag coverage. This is due to the fact that the RFID tag coverage optimization is a very complex optimization problem due to the high dimensional characteristic. Besides the parameter of PSO, the optimization problem also has several parameters to be considered such as the number of tags, number of readers and working space area.

In the RFID tag coverage optimization, the setting of parameters is very critical. This is because the RFID system is highly intricate and it has to be planned very properly. If the system works correctly, the business owner can be considered as a very fortunate person. However, if the RFID system fails to fulfill its objectives, the system will be a huge burden to the corporation or company.

In the parameter tuning process, any slight changes to the parameters will affect the end results greatly. This kind of uncertainty should not have bothered a highly complex system such as the RFID system. As a result, prospective companies and corporations are in urgency to have a reliable RFID planning system.

In order to enhance the parameter tuning of PSO, this research tends to propose a novel parameter tuning method. This method will improve the reliability and accuracy of PSO algorithm for the purpose of optimizing the RFID tag coverage. To do that, a number of research questions need to be taken into account. The research questions are as follows:

- 1) How to prepare an objective function to be optimized by the PSO algorithm?
- 2) What is the best parameter tuning for PSO in optimizing the RFID tag coverage?
- 3) Is there any parameter tuning of PSO that fit all RNP conditions?
- 4) What are the significant parameters of PSO?
- 5) How to quantify the value of parameter significance in PSO?

These questions can be considered as the guidance to develop the novel parameter tuning method for PSO algorithm. This method should be applicable to all RNP conditions.

### **1.3 Research Objectives**

This research comprises of several objectives:

- i. To construct the objective function of the RFID tag coverage optimization that exposes the direct correlation between the parameters of RFID tag coverage and the solutions of PSO.

- ii. To justify the best parameter tuning of PSO for solving RFID tag coverage optimization in all RNP conditions.
- iii. To evaluate the performance of the proposed method against other PSO variants.

#### 1.4 Research Scopes

This research consisted of several scopes:

- i. In this research, the type of RFID tag in used was RFID passive tag. This kind of tag has no internal power source and it is powered by radio waves from readers. The type of antenna used is an isotropic radiator antenna.
- ii. To represent all RNP conditions, several case studies (scenarios) were used. These scenarios are within a given scopes (refer Chapter 5).
- iii. This research covers two categories of parameters: PSO and RNP parameters. Additionally, these parameters are set in a specific range. The name and range of each parameter can be seen in Table 1.1.
- iv. The correction factor value (refer Table 1.1) represents two variables: Cognitive weight and Social weight. In this research, the values for both variables are set as equal. As a result, the value of the correction factor represents the values of both variables.
- v. The RFID application focuses in this research was asset tracking and management. All readers are activated all the time in order to track tagged assets. The tagged assets are located around a working area. Due to that, all readers needed to be deployed in order to track the locations of tagged assets in a real time manner.
- vi. This research only focuses on Particle Swarm Optimization (PSO) algorithm for solving RFID tag coverage optimization.

- vii. This research uses the original version of PSO algorithm because this version is deemed suitable for all optimization fields (Beielstein, *et al.*, 2002; Y.-J. Gong, *et al.*, 2012). Additionally, by choosing the original version of PSO, this research acts as a starting point for using 2 DOE session in PSO. Although there are a lot of PSO variants produced by other researchers, the author tends to choose the original version because there is no guarantee that the other PSO variants can perform better compared to the original PSO in the field of RFID tag coverage optimization. According to the author's best knowledge, every PSO variant is developed for a particular usage and for now, the original version of PSO is the most suitable.
- viii. Matlab software was used for writing the code and running the simulation. Prior to code writing in Matlab, a pseudo code of PSO algorithm were written.
- ix. Minitab 16 software was used for performing DOE analysis and generating some useful graphs.

Table 1.1: Name and range for each parameter

No.	Name of parameter	Category	Range	Unit
1	Number of iterations	PSO parameter	50-200	Iterations
2	Number of swarms		50-200	Swarms
3	Inertia weight value		0.5-3.0	N.A.
4	Correction factor value		0.5-3.0	N.A.
5	Number of readers	RNP parameter	1-10	Readers
6	Number of tags		10-100	Tags
7	Working space area		5m×5m – 30m×30m	m <sup>2</sup>

## 1.5 Thesis Organization

In this chapter, brief introductions about Radio Frequency Identification (RFID) technology, RFID network planning (RNP) and Particle Swarm Optimization (PSO) algorithm were discussed. The parameter tuning weakness of PSO was also elaborated. Moreover, additional information about this research such as the research objectives and scopes were also highlighted.

In the next chapter, some theories and significant contributions will be discussed that related to the RFID, RNP, RFID tag coverage optimization, Particle Swarm Optimization (PSO) and Design of Experiment (DOE). Additionally, any related studies that are significance to this research are also discussed.

The third chapter covers the general research methodology. In this chapter the processes for developing the research methodology are explained. The research flowchart with a greater level of details is also provided.

In the fourth chapter, the methodology for constructing the objective function of RFID tag coverage optimization is properly discussed. Additionally, the steps for developing the Matlab codes are also presented.

The integration between PSO and DOE is explained in the fifth chapter. This chapter will also discuss the parameter tuning method that is applicable to all RNP conditions.

The performance of the proposed method was measured in Chapter 6. This chapter is also considered as the chapter for the results and discussion. The performance comparison is also considered as the validation process.

Finally, the final chapter provides a conclusion for this research and some recommendations for future works. Moreover, the contributions made by this research will also be highlighted

## **CHAPTER 2**

### **LITERATURE REVIEW**

This chapter focuses on the important theories and knowledge related to the research topics such as the cellular network planning, RFID technology, RFID Network Planning (RNP), RFID Tag Coverage Optimization, Particle Swarm Optimization (PSO) algorithm and Design of Experiment (DOE) technique. Also presented are the related works and models that are strongly related to this research. The critical findings in this chapter will be used as the foundation for developing the research methodology.

#### **2.1 Introduction to Cellular Network**

A cellular network is a mobile network that is used to provide services from the base stations to the subscribers. The base stations have a limited power supply and they can only cover a limited geographical area. This area is also known as a cell. Since the base station owns a limited power, a concept of frequency reuse can be applied without causing any interference between the transmitters. The cellular network system is suitable for a radio wave related application with limited frequency resources (Laiho-Steffens, Wacker, and Aikio, 2000; L. Song and Shen, 2010; Wallace and Walton, 1994).

Each cell is set with different frequency in order to avoid interference and maximizing the bandwidth. A combination of cells enables the radio wave to cover a

large geographical area. From here, any mobile devices such as mobile phones and pagers are able to establish the connection (communicate) with each other (Byoung-Seong, Jong-Gwan, and Han-Kyu, 2002; Fasbender, Reichert, Geulen, Hjelm, and Wierlemann, 1999).

The cellular network is improved from time to time. As a result, this network has a lot of generations (refer Table 2.1). Any ascending generation provides a faster connection and the ability to transfer a bigger amount of data (Hämäläinen, 2008b; Mishra, 2004).

Table 2.1: The generations of cellular network

Generation	Description	Protocol	Maximum Speed
1G	Analogue services to cell phones, voice only and no SMS or data services.	<ul style="list-style-type: none"> <li>▪ AMPS</li> <li>▪ DataTAC</li> <li>▪ FDMA</li> <li>▪ Mobitex</li> <li>▪ NMT</li> <li>▪ TACS</li> </ul>	2.4 Kbps
2G	The transition from analogue to digital services. The ability to store, copy, encrypt and compress data were provided.	<ul style="list-style-type: none"> <li>▪ CDMA</li> <li>▪ GSM</li> <li>▪ IDEN</li> <li>▪ PCS</li> <li>▪ TDMA</li> </ul>	20Kbps
2.5G	Introduction of packet switching of data other than circuit switching	<ul style="list-style-type: none"> <li>▪ CDMA2000 1 x RTT</li> <li>▪ GPRS</li> <li>▪ HSCSD</li> <li>▪ EDGE</li> <li>▪ WiDEN</li> </ul>	<ul style="list-style-type: none"> <li>▪ 144Kbps</li> <li>▪ 114Kbps</li> <li>▪ 64Kbps</li> <li>▪ 384Kbps</li> <li>▪ 100Kbps</li> </ul>
3G/ 3.5G/	Provide the mobile	<ul style="list-style-type: none"> <li>▪ CDMA2000 EVDO</li> </ul>	<ul style="list-style-type: none"> <li>▪ 2.4Mbps</li> </ul>



3.75G	broadband access to smart phones and modem	<ul style="list-style-type: none"> <li>▪ CDMA2000 EVDV</li> <li>▪ UMTS</li> <li>▪ WCDMA</li> <li>▪ CDMA2000/ EVDO-Rev A</li> </ul>	<ul style="list-style-type: none"> <li>▪ 2.4Mbps</li> <li>▪ 2Mbps</li> <li>▪ 2Mbps</li> <li>▪ 3.1Mbps</li> </ul>
4G	Provide faster mobile broadband access to smart phones and modem	<ul style="list-style-type: none"> <li>▪ LTE</li> <li>▪ WiMAX</li> </ul>	<ul style="list-style-type: none"> <li>▪ 100Mbps</li> <li>▪ 128Mbps</li> </ul>

The cellular network is deployed in a very large geographical area. This network is also very synonym to the extremely large scale deployment. As a result, the planning and optimization of cellular network is a topic that may not see any end. This is due to the fact that the parameters for the planning process keep changing and expanding such as the number of subscribers, the density of transceivers, the speed of packet data and the introduction of new cellular generations that will never be stopped (Amaldi, Capone, Malucelli, and Mannino, 2006; Elkamchouchi, Elragal, and Makar, 2007).

## 2.2 Cellular Network Planning

Cellular network planning is crucial for obtaining the sufficient network coverage. It can also offers a mobile network service with an acceptable Quality of Service (QoS). The quality of voice and data services manage to fulfill the expectation of subscribers and the network providers will be able to maintain their market share.

Another aspect for consideration is the economical efficiency for the construction of the network's infrastructure. It is worth to note that the cost for building a base station is very high. As a result, the number of base stations should be optimized in order to control the construction and management cost. On top of that, the signal interference should be reduced as it will jeopardize the life span of the

whole system (Byoung-Seong, *et al.*, 2002; A. Wacker, Laiho-Steffens, Sipila, and Jasberg, 1999).

The cellular network planning is also considered as a highly complex process. The planned network's infrastructure should be flexible in order to cater the future demand of a faster data transfer. This is due to the fact that the number of subscribers and coverage area will keep expanding. A good network planning will yield an infrastructure that is easy to maintain and expand. Additionally, in order to fulfill certain demands, an excellent network infrastructure will need fewer modifications to be made to the existing infrastructure (Tutschku, 1998; Wallace and Walton, 1994). The methods for performing cellular network planning are shown in Figure 2.1.

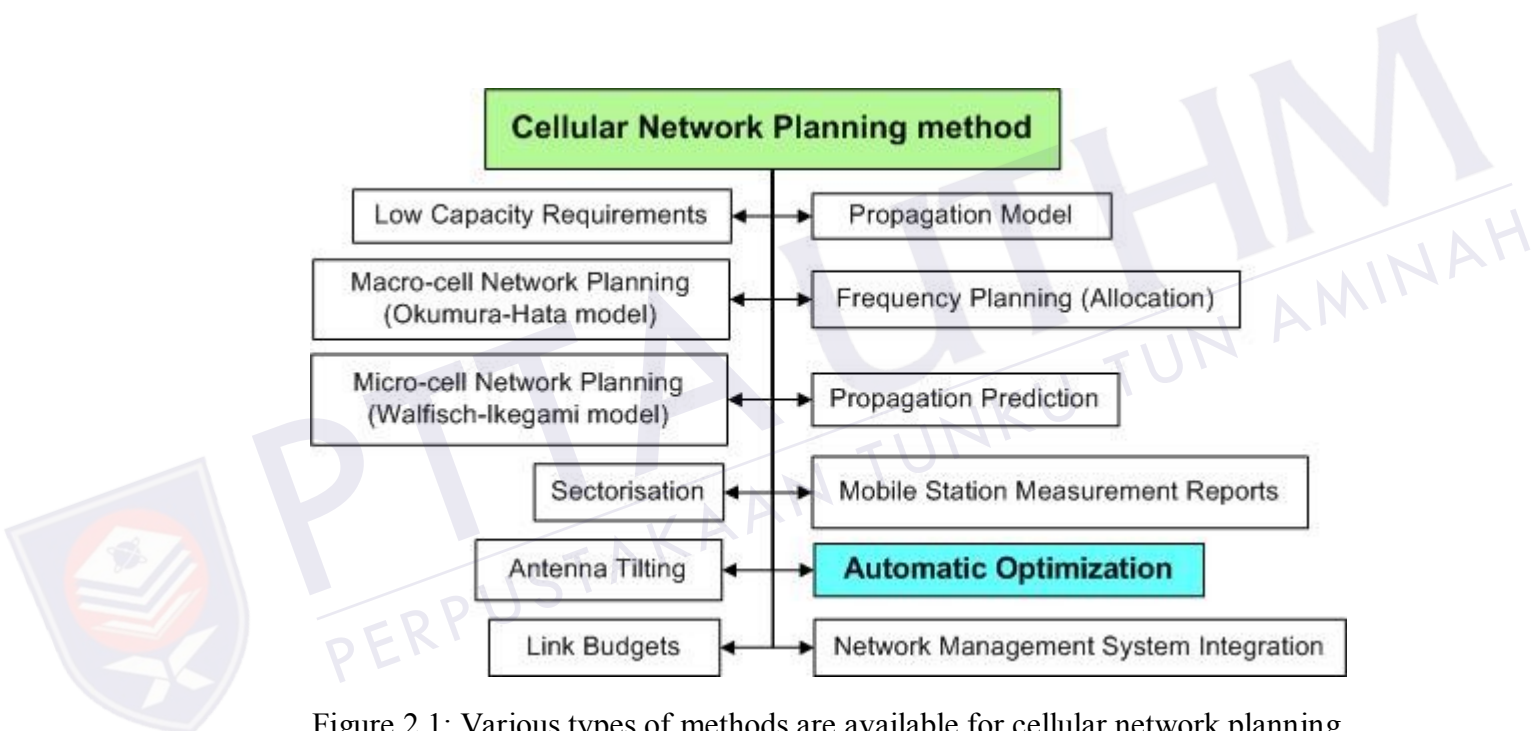


Figure 2.1: Various types of methods are available for cellular network planning (Laiho and Wacker, 2001; Laiho, Wacker, and Novosad, 2006; Mishra, 2004)

Based on the figure, some of the methods were developed during the 1<sup>st</sup> generation of cellular network. The methods are low capacity requirement, Okumura-Hata model and Walfisch-Ikegami model. The low capacity requirement was used to plan the first version of analog networks. During that time, the main objective of cellular network planning is to provide the optimal coverage to the subscribers. There is no issue related to the signal interference and data traffic because the number of subscribers is not really significant (Gamst, 1987; Laiho, *et al.*, 2006).

The Okumura-Hata model is still in use for planning the macro-cell network. There are certain enhancement made by the previous researchers in order to made the model accepted in a better way (Castro, Gomes, Ribeiro, and Cavalcante, 2010; Priya, 2010). As a result, this model is compatible with the 3G network.

In the Walfisch-Ikegami model, the main assumption is the transmitter's antenna is located on a rooftop and the radio wave is transmitted in multiple directions. This assumption is crucial for minimizing the traffic density. This model also utilizes the path loss formulation from the Walfisch-Bertoni model (Har, Watson, and Chadney, 1999; Laiho, *et al.*, 2006). In the Walfisch-Ikegami model, the parameters in consideration are the height of buildings and the distances between buildings. Moreover, this model also considers additional factors such as the used frequency, street orientation and antenna's height (Rozal and Pelaes, 2007).

The sectorisation method is able to reduce the interference between transmitters (base stations). The issue related to the signal interference becomes more prominent as the increasing number of subscribers in the 2G network yielded a higher site density. The sectorisation method is able to yield a denser environment of frequency reuse. This is possible because the omni-directional antenna in the base station is replaced with three sector antennas with  $120^\circ$  opening. Each antenna formed a new sector and each sector can be considered as a new cell. Moreover, each sector can be set with its own frequency. Sectorisation is also cost effective because it does not need the construction of a new base station (Achim Wacker, Laiho-Steffens, Sipila, and Heiska, 1999; S.-W. Wang and Wang, 1993).

Link budget is the analysis to be performed before commencing the network planning process. The link budget formulation is related to the magnitude of signal strength. Moreover, this method is still in use until today. In the link budget analysis, the parameters of interest are the receiver sensitivity, path loss, noise, antenna loss and cable loss. Additionally, the gains and losses from the transmitter is also calculated (Hämäläinen, 2008a; Nuza and Mazrekaj, 2012).

Propagation models are useful for the analysis of higher site densities. These models utilize the concept of ray tracing (Hämäläinen, 2008b). The frequency planning method is very useful for fulfilling the increasing capacity demands. In the method, the frequency reuse distance is calculated and the repeat cell pattern is determined. The frequency is also divided into homogenous groups before being

inputted into the planning tool. At the end of the analysis, the C/I and C/A plots are generated for the result checking and fault detection processes (Elayoubi, Ben Haddada, and Fourestié, 2008; L.-C. Wang, Stuber, and Lea, 1997).

In order to improve the spectrum efficiency in GSM and saving some analysis time, the automatic frequency planning system was introduced. Moreover, the cellular network planning can also be done using the mobile station measurement reports. The reports are useful for assisting the network control process such as the planning and optimization stages (Barco, Canete, Diez, Ferrer, and Wille, 2001; Wille and King, 1998).

One of the most recent methods in cellular network planning is the automatic optimization. In this method, algorithms are used to run the analysis. The current trend in automatic optimization is the application of nature inspired algorithms such as Genetic Algorithm (GA), Particle Swarm Optimization (PSO), Bacteria Foraging Optimization (BFO), Artificial Bee Colony (ABC) and Firefly algorithm. These algorithms are also becoming the backbones of the network planning software (Elkamchouchi, *et al.*, 2007; Riaz, Imran, and Hoshyar, 2010). Based on the explanation of the methods in cellular network planning, it can be seen that this research fall into the scope of automatic optimization (refer Figure 2.1)

### **2.2.1 The Importance of Cellular Network Planning**

The main aim of network planning is to fulfill the customers demand with an acceptable Quality of Service (QoS). This is crucial for the network providers to avoid losing their market share (Amaldi, *et al.*, 2006; Qiang, *et al.*, 2006). Additionally, the cellular network planning yields the ability to deal with the interference from other signals (Gamst, 1987; L. Song and Shen, 2010).

The newer generations of cellular networks are faster and carry higher data volumes. Additionally, the number of subscribers is also increasing rapidly. This scenario demands the enhanced version of cellular network planning system. Since the parameters for cellular network keep changing and expanding, the development

of cellular network planning systems will not come to an end (Rahman, Matin, and Rahman, 2013).

The cost and complexity of a network are highly dependent on the number of readers (transmitter). A good planning system is able to optimize the number of transmitters needed and from here; the cost and complexity of network will be under control (Corre and LOSTANLEN, 2009; Engels and Sarma, 2002; Qiang, *et al.*, 2006).

The continuous development in the cellular network pushes the performance of the information technology system to a higher level. To complement the continuous stream of information to the subscribers, the concept of the internet of things was born. In this concept, a technology known as the Radio Frequency Identification (RFID) is heavily exploited. The RFID technology is very efficient for the purpose of tracking and managing the assets and it has become increasingly famous among companies, organizations, retailers and others (Bolic, Simplot-Ryl, *et al.*, 2010; Hasnan, Bareduan, Nawawi, and Sidek, 2013; Nawawi, Hasnan, and Ahmad Bareduan, 2011; Sarma, 2004).

### **2.2.2 The Relation between Cellular Network and RFID Technology**

As mentioned in the previous section, the needs to track and manage the assets are blooming along the continuous development of cellular network technology. The subscribers (customers) of the cellular network services demand a faster mobile internet connection. This trend is predictable since the shocking number of smart phones purchases. Along with the trend, the needs for a real time assets tracking and management are also on the rise. There are more companies started to implement the RFID system in their supply chain. This growing trend is also assisted by the escalating number of activities related to online shopping and rapid advertisement approach (Huseynov and Yıldırım, 2014; Malviya and Sawant, 2014).

The concept of the internet of things offers the ability of assets to “communicate” wirelessly. This scenario opens a new horizon to the development of the cellular networks. Moreover, the principles used in the cellular network are

applicable to the RFID network. This is because both networks reside in the same category (UHF to LF) as seen in the electromagnetic spectrum (refer Figure 2.2). Additionally, the Friis transmission equation (Equation (2.1)) is used in both networks for the purpose of mathematical models development (Chen, *et al.*, 2011; D. Dobkin, 2008; Laiho, *et al.*, 2006). Both networks also have the same goal: To achieve the acceptable Quality of Service (QoS) (Levis, Johnson, and Teixeira, 2010; Qiang, *et al.*, 2006).

$$\frac{P_r}{P_t} = G_t G_r \left( \frac{\lambda}{4\pi R} \right)^2 \quad (2.1)$$

Notation	$P_r$	: Power input at receiving antenna
	$P_t$	: Power output at transmitting antenna
	$G_t$	: Transmitting antenna gain
	$G_r$	: Receiving antenna gain
	$\lambda$	: Wavelength
	$R$	: Distance between antennas

In RFID technology, an RFID reader (transmitter) emits a radio wave signal and the signal will be received by an RFID tag (receiver). To complete the cycle of communication, the signal from the reader is used by the tag to power itself and with the remaining energy from the signal; the tag will bounce the signal back to the reader. In this “reply” signal, the ID of the tag will be carried over. This reply signal is also considered as the uplink signal (Harvey Lehpamer, 2012; Albert Lozano-Nieto, 2011; Nawawi, *et al.*, 2011). Unlike the cellular network, the uplink signal of an RFID system has to be taken into consideration (Qiang, *et al.*, 2006).



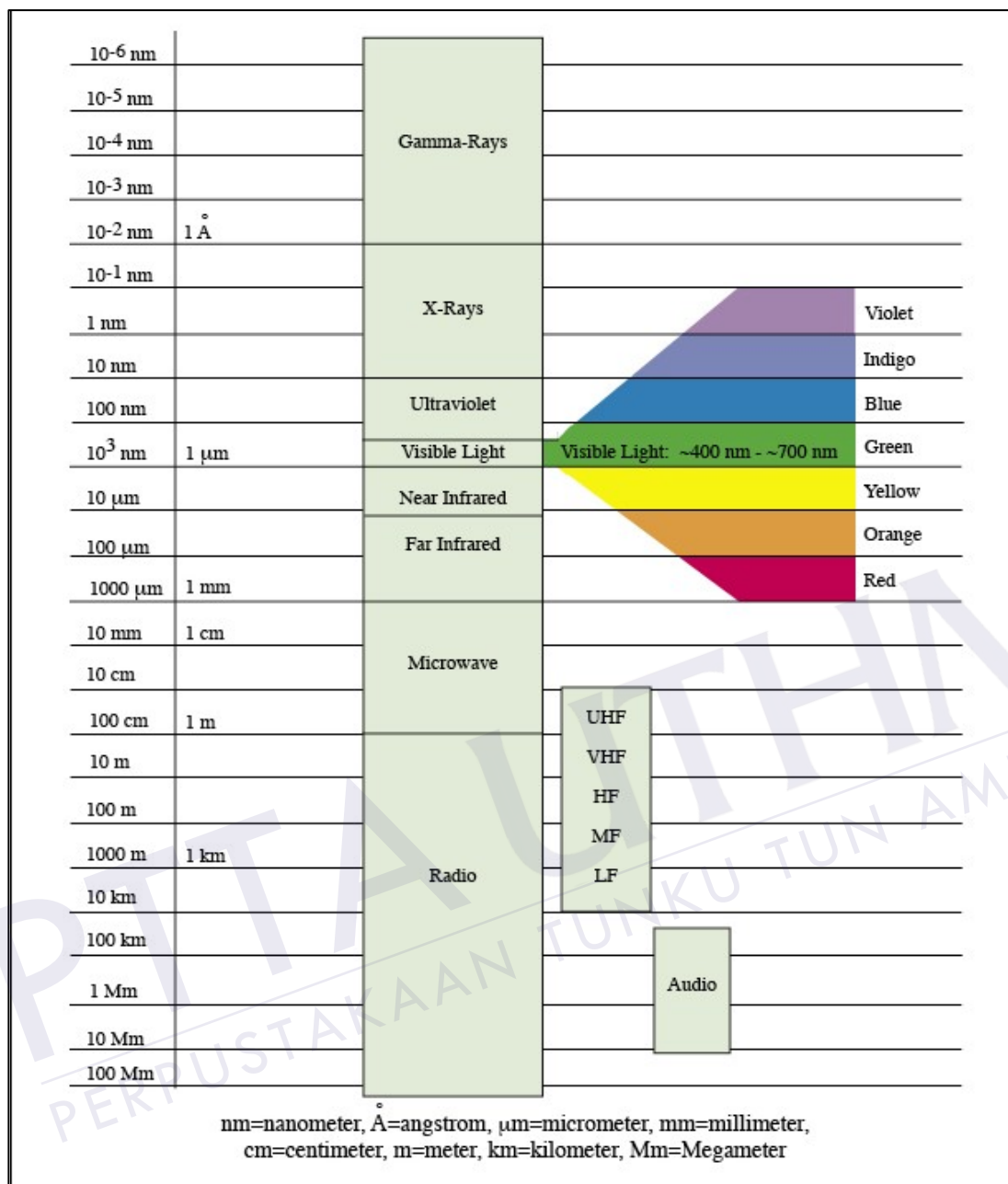


Figure 2.2: The Electromagnetic Spectrum (LASP)

RFID system is more favorable nowadays because it offers the ability to track assets in a real time manner. RFID system is also becoming the main backbone for establishing the concept of the internet of things. In this concept, any tagged assets exist virtually and the management of the assets can be done anywhere on the globe (Miles, Sarma, and Williams, 2008; Sarma, 2004). Currently, the RFID system is on its way to be fully integrated in the supply chain industry. The integration processes are done in a very extensive way because the cost for deploying this technology is

becoming more affordable to the masses (Bolic, Simplot-Ryl, *et al.*, 2010). The next section uncovers some details about the RFID system.

## 2.3 Radio Frequency Identification (RFID) System

RFID is considered as a mature technology nowadays. This technology has a huge potential to solve the asset management related problems such as asset security, identification and tracking (Al-Ali, Sajwani, Al-Muhairi, and Shahenn, 2007). RFID is also able to speed up the process of checking and monitoring of tasks and provide real-time information about the process in interest (H. Chen and Y. Zhu, 2008; Mehrjerdi, 2009). RFID is a part of Auto-ID systems which consists of another identification elements such as smart cards and barcodes (Fuhrer, Guinard, and Liechti, 2006).

### 2.3.1 RFID Equipments

RFID technology is accepted by various organizations and this technology is expected to become our everyday life partners (Fuhrer, *et al.*, 2006). RFID system consists of three main elements (refer Figure 2.3): a tag, a reader and a middleware. The tag, also called a transponder, is made of a chip and an antenna. It contains a unique code that provides the unique identification of each object (Aysegul, Nabil, and Stephane, 2008; Qiang, *et al.*, 2006). The reader, also known as an interrogator has an antenna which emits radio signals and receive signal in return from the tag. The distance of the reading range depends on multiple factors; the frequency that is used, the orientation and polarization of the reader and the deployment environment (Aysegul, *et al.*, 2008). Lastly, the middleware can provide the primary link between RFID readers and databases (Fagui and Zhaowei, 2006). RFID technology can be divided into three categories: 1) RFID system operating frequency, 2) RFID tag



power source and 3) Method of communication between tag and reader (Bolić, Athalye, and Li, 2010).

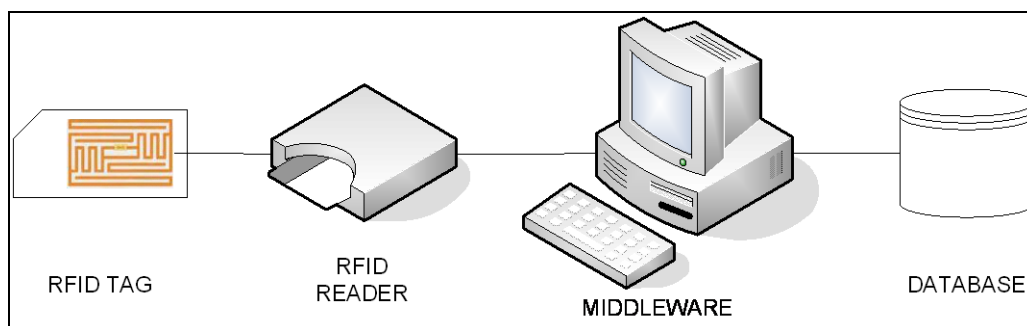


Figure 2.3: RFID System Components (Elshayeb, Hasnan, and Yen, 2009)

### 2.3.1.1 RFID Tag

An RFID tag generally contains an antenna and an electronic chip (Fuhrer, *et al.*, 2006). RFID tag communicates with the RFID reader using a method named Backscatter Modulation (Bolić, *et al.*, 2010; Qiang, *et al.*, 2006). In this kind of communication method, the tag is powered by radio wave transmitted to them by the RFID reader. This tag will send information back to reader using the radio wave reflection.

There are three (3) types of tags: Active, passive and semi-passive (Angeles, 2005). An active RFID tag is powered by a battery (Angeles, 2005). Thus, it needs a regular maintenance and active tag costs more than passive tag. In the other hand, an RFID passive tag is powered by radio waves emitted by RFID readers. This kind of tag will use the energy from the radio waves to send back signal to the RFID reader. The passive tag is preferred by most organizations because of its benefits such as low cost to deploy, no maintenance needed, small sized and less complex.

### 2.3.1.2 RFID Reader

An RFID reader is a very crucial component in an RFID system that located between the RFID tag and the event filter (Glover and Bhatt, 2006). It is used to generate and transmit radio frequency (RF) energy that will wake up the RFID tag. Another function of an RFID reader is to receive and decode backscatter signal received by the tag (Glover and Bhatt, 2006; Karmakar, 2010; Harvey Lehpamer, 2012). This reader and tag communication system is also known as a master-slave relationship with the reader acts as the master while the tag is the slave (Karmakar, 2010). In addition, an advanced version of an RFID reader has the capability to read and write data on the tag. For UHF readers, this task can be done within the frequency of 865-868 MHz for ETSI and 902-928 MHz for FCC (Siemens, 2012).

An RFID reader consists of three main parts: 1) Antenna, 2) Transceiver and 3) Control Section. The antenna is needed for sending and receiving RF signals. In order to generate RF signal for transmission and reception, the transceiver has to be in operation. The transceiver will operate under two signal path (signal from tag and signal to tag). The third part, the control section, consists of microprocessor, memory block, analog to digital converters and communication block (Karmakar, 2010). The control section, as it name suggests, perform several tasks such as operating signal modulation, initiating anti collision procedures and decoding received signal from tag. The microprocessor is used to decode data. This part also performs digital signal processing over received data from tag (Glover and Bhatt, 2006; Karmakar, 2010; Harvey Lehpamer, 2012; F. Wang and Liu, 2005a).

RFID readers can be divided into two main categories (fixed reader and mobile reader) (Harvey Lehpamer, 2012; Siemens, 2012). A fixed reader comes with cables for power supply and data transfer. This kind of reader is usually mounted on walls or doors. In the other hand, a mobile reader is also known as handheld RFID reader. A handheld reader is powered by a battery and it can transmit data wirelessly (Siemens, 2012).

There are two communication types for RFID readers which are *read-only* and *read-write*. For the read-only communication type, the reader will always transmit RF signal and receive backscatter (response) signal from tag. This type of

communication is also called *tag talks first*. An RFID reader with read-write communication type will send command to tag before initiating reading or writing activity (A. Lozano-Nieto, 2010). As the RFID technology becomes matured, the speed of reading and writing to tag are significantly reduced and for some manufacturers, the reading rate is equal to the writing rate (Siemens, 2012). A detail classification of RFID readers can be seen in Figure 2.4 (Karmakar, 2010).

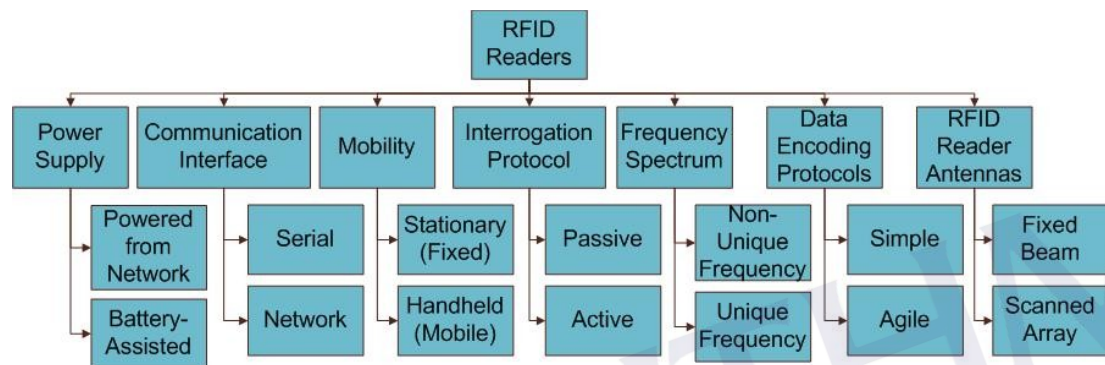


Figure 2.4: Classification of RFID Readers (Karmakar, 2010)

Applications of RFID readers are in numerous industries such as manufacturing, supply chain, logistics, retailers, transportation services and others. In the manufacturing industry, RFID readers are deployed in various locations around the manufacturing facility such as single reading stations, production processes, assembly processes, conveyor systems, inventory systems, material flow control and material handling systems. Other major applications of RFID readers are in the field of Supply Chain Management (SCM). In SCM, RFID readers are fixed on the forklifts, pallets, containers, trucks and gate entrance. RFID reader also finds its way to the distribution center and retailer outlets (Harvey Lehpamer, 2012; Siemens, 2012).

### 2.3.1.3 RFID Middleware

An RFID system will yield a large volume of data (F. Wang and Liu, 2005b). In order to utilize an RFID system, these data must have value and can assist the decision making processes. The main role of RFID middleware is to filter and process data that comes from deployed RFID readers. A middleware is able to sort and process data according to the system requirements (Bolić, *et al.*, 2010). These data must be presentable to the higher level software. A middleware will pilot the readers and process data from the reader so that the data will be useful for the decision maker (Fuhrer, *et al.*, 2006). Middleware will serve as bridges between the physical RFID world and the rest software infrastructure (F. Wang and Liu, 2005a).

According to Glover (2006), RFID middleware consists of three main components. The first is Application Level Interface that is used to summarize information from device interface. Besides, Event Manager is needed in a middleware for processing and filtering raw data from RFID reader. This step is crucial for providing meaningful information from the RFID reader and useful for decision making process. In order to allow the application level interface to manage RFID readers, a middleware must have the Reader Adapter.

## 2.4 The Horizon of RFID Technology

Low-cost RFID tag is capable of reading or writing the information of an entity without contact physically, while it possesses a fast recognition speed, and has a relatively greater storing ability compared with bar-code (Asif and Mandviwalla, 2005; Fagui and Zhaowei, 2006; Fuhrer, *et al.*, 2006; Glover and Bhatt, 2006). Data-on-tag can also be modified for information updating purpose (Bolić, *et al.*, 2010).

When using a bar-code system for detection purpose, label must be correctly positioned relatively to the reader. This characteristic is called Line of Sight which

requires human intervention for scanning purpose and it will provide chance for error and inefficiencies (Al Kattan and Al-Khudairi, 2007; Fuhrer, *et al.*, 2006; Sahin, Dallery, and Gershwin, 2002). Using RFID, the RFID label or tag can be scanned from a greater distance and this will eliminate the need for Line of Sight (Al Kattan and Al-Khudairi, 2007; Angeles, 2005; Glover and Bhatt, 2006; F. Wang and Liu, 2005a).

RFID technology also offers a higher read rate compared to barcodes and more than one tag can be read simultaneously (Bolic, Athalye, and Li, 2010). This technology also capable of reading objects in motion and data-on-tag can be read under hard conditions (Fuhrer, *et al.*, 2006). With all of these advantages, RFID technology has a potential to achieve global asset visibility by automating and enhancing asset management system (Angeles, 2005; Bolić, *et al.*, 2010; Glover and Bhatt, 2006). In addition, RFID has the potential to bring new transparency to the supply chain (Asif and Mandviwalla, 2005; Clarke, Twede, Tazelaar, and Boyer, 2006).

Despite all the advantages offered by RFID technology, there are several challenges before implementing this technology. One main challenge is the non-compatibility between different operating frequencies. Communication between RFID equipments or devices will not initiate if the operating frequencies are different (Bolić, *et al.*, 2010). The operating frequencies are different according to RFID equipments manufacturers.

Furthermore, to implement the RFID system, considerable costs will be needed. In other words, adopting RFID in an existing system will cost a lot of funds. Due to that, a lot of planning tasks need to be executed before implementing such system. RFID adopters must not let their RFID system to fail easily. A study by Fred *et al.* (2007) focused on identifying IT problems and challenges before adopting RFID technology in a particular system. Fred mentioned that IT personnel must address the technology infrastructure, business processes and managerial issues of a particular system before implementing RFID into that particular system. Moreover, Fred also suggested that IT personnel need to gain knowledge about RFID data life cycle because they must take into consideration on how the data will be transferred in an RFID system. Data life cycle can be divided into six (6) stages (Fred, Richard, Roger, and Ik-Whan, 2007):

- i. Source data acquisition (reading RFID data and integrating with other source data);
- ii. Integrating source data with enterprise transactions systems;
- iii. Integrating data across organizations;
- iv. Data warehousing and analytic processing;
- v. Data archiving (backup and replication); and
- vi. Data deletion and disposal.

To deploy an RFID system in a large-scale, a lot of readers and tags are needed. This scenario will contribute to a higher system complexity and the performance related problems will arise (Bolić, *et al.*, 2010). One of them is limited read range of RFID reader (Al-Ali, *et al.*, 2007).

The RFID reader read-rate also depends on the orientation of tags and the content of package that the tag is mounted to (Al-Ali, *et al.*, 2007; Clarke, *et al.*, 2006). In 2006, a research carried out by Robert H. Clarke *et al* manages to find out that the read rate of RFID tags is strongly affected by content of package and orientation of tags. In the research, the detected tags were only 25% because these tags are mounted on boxes filled with bottles of water. Tags on rice-filled jars have much better read rates which was 80.6%. However, tags those are facing outwards and towards the direction of antenna have better read rates compared to tags that are facing downwards. This scenario need to be taken into account by companies who intends to deploy RFID technology (Clarke, *et al.*, 2006; Glover and Bhatt, 2006). A survey on the latest RFID products in the market is also crucial for knowing that there is a solution for such problem.



## REFERENCES

- Ahson, S., and Ilyas, M. (2008). *RFID handbook: applications, technology, security, and privacy*: CRC.
- Ahson, S. A., and Ilyas, M. (2010). *RFID handbook: applications, technology, security, and privacy*: CRC press.
- Al-Ali, A. S. A., Sajwani, F., Al-Muhairi, A., and Shahenn, E. (2007). *Assessing the Feasibility of Using RFID Technology in Airports*. Paper presented at the RFID Eurasia, 2007 1st Annual.
- Al Kattan, I., and Al-Khudairi, T. (2007). *Improving Supply Chain Management effectiveness using RFID*. Paper presented at the Engineering Management Conference, 2007 IEEE International.
- Alotto, P., Gaggero, M., Molinari, G., and Nervi, M. (1997). A design of experiment and statistical approach to enhance the generalised response surface method in the optimisation of multim minima problems. *Magnetics, IEEE Transactions on*, 33(2), 1896-1899.
- Amaldi, E., Capone, A., Malucelli, F., and Mannino, C. (2006). Optimization problems and models for planning cellular networks *Handbook of optimization in telecommunications* (pp. 917-939): Springer.
- Anderson, M. J., and Whitcomb, P. J. (2000). *DOE simplified: practical tools for effective experimentation*: Productivity Portland.
- Angeles, R. (2005). RFID Technologies: Supply-Chain Applications and Implementation Issues. *Information System Management*, 15.
- Asif, Z., and Mandviwalla, M. (2005). Integrating the Supply Chain with RFID: An In-Depth Technical and Business Analysis. *Communications of Association for Information System*, 15(24).
- Attaway, S. (2011). *Matlab: A Practical Introduction to Programming and Problem Solving: A Practical Introduction to Programming and Problem Solving*: Butterworth-Heinemann.

- Aysegul, S., Nabil, A., and Stephane, D.-P. (2008). *A simulation approach to evaluate the impact of introducing RFID technologies in a three-level supply chain*. Paper presented at the Proceedings of the 40th Conference on Winter Simulation.
- Barco, R., Canete, F. J., Diez, L., Ferrer, R., and Wille, V. (2001, 2001). *Analysis of mobile measurement-based interference matrices in GSM networks*. Paper presented at the Vehicular Technology Conference, 2001. VTC 2001 Fall. IEEE VTS 54th.
- Beielstein, T., Parsopoulos, K. E., and Vrahatis, M. N. (2002). Tuning PSO parameters through sensitivity analysis. *HT014601767*.
- Ben, N., Wong, E. C., Yujuan, C., and Li, L. (2009, 26-28 Dec. 2009). *RFID Network Planning Based on MCPSO Alogorithm*. Paper presented at the Information Science and Engineering (ISISE), 2009 Second International Symposium on.
- Bhattacharya, I. (2011). Tracking and Monitoring of Tagged Objects employing Particle Swarm Optimization algorithm in a Departmental Store. *IIUM Engineering Journal*, 12(1), 1-12.
- Bhattacharya, I., and Roy, U. K. (2010). Optimal Placement of Readers in an RFID Network Using Particle Swarm Optimization. *International Journal of Computer Networks & Communications*, 2(6).
- Bhattacharya, I., and Roy, U. K. (2010). Optimal placement of readers in an RFID network using particle swarm optimization. *International Journal of Computer Networks & Communications*, 2(6), 225-234.
- Blondin, J. (2009). Particle swarm optimization: A tutorial. *from site: [http://cs.armstrong.edu/saad/csci8100/pso\\_tutorial.pdf](http://cs.armstrong.edu/saad/csci8100/pso_tutorial.pdf)*.
- Bolic, M., Athalye, A., and Li, T. H. (2010). Performance of passive UHF RFID systems in practice. *RFID Systems: Research Trends and Challenges*.
- Bolić, M., Athalye, A., and Li, T. H. (2010). Performance of passive UHF RFID systems in practice. *RFID Systems*, 1-22.
- Bolic, M., Simplot-Ryl, D., and Stojmenovic, I. (2010). *RFID systems: research trends and challenges*: John Wiley & Sons.
- Brown, M., Patadia, S., and Dua, S. (2007). *Mike Meyers' CompTIA<sup>R</sup> RFID+<sup>TM</sup> Radio Frequency Identification Certification Passport*. New York: The McGraw-Hill Companies.



- Brown, P., Hartmann, P., Schellhase, A., Powers, A., Brown, T., Hartmann, C., *et al.* (2007). *2E-3 Asset Tracking on the International Space Station Using Global SAW Tag RFID Technology*. Paper presented at the Ultrasonics Symposium, 2007. IEEE.
- Bustillo, M. (2010). Wal-Mart radio tags to track clothing. *Wall Street Journal*, 23, A1.
- Byoung-Seong, P., Jong-Gwan, Y., and Han-Kyu, P. (2002, 2002). *The determination of base station placement and transmit power in an inhomogeneous traffic distribution for radio network planning*. Paper presented at the Vehicular Technology Conference, 2002. Proceedings. VTC 2002-Fall. 2002 IEEE 56th.
- Calégari, P., Guidec, F., Kuonen, P., Chamaret, B., Ubéda, S., Josselin, S., *et al.* (1996). Radio network planning with combinatorial optimization algorithms. *Proceedings of the ACTS Mobile Telecommunications Summit 96*, 2, 707-713.
- Castro, B., Gomes, I., Ribeiro, F., and Cavalcante, G. (2010). *COST231-Hata and SUI Models performance using a LMS tuning algorithm on 5.8 GHz in Amazon Region cities*. Paper presented at the Antennas and Propagation (EuCAP), 2010 Proceedings of the Fourth European Conference on.
- Chamaani, S., Mirtaheri, S. A., Teshnehlal, M., and Shooredeli, M. A. (2007). *Modified multi-objective particle swarm optimization for electromagnetic absorber design*. Paper presented at the Applied Electromagnetics, 2007. APACE 2007. Asia-Pacific Conference on.
- Chan, S., Connell, A., Madrid, E., Dongkuk, P., and Kamoua, R. (2009). *RFID for personal asset tracking*. Paper presented at the Systems, Applications and Technology Conference, 2009. LISAT '09. IEEE Long Island.
- Chapman, S. J. (2008). *MATLAB programming for engineers*: Thomson Engineering.
- Chen, H., and Zhu, Y. (2008). *RFID networks planning using evolutionary algorithms and swarm intelligence*. Paper presented at the Wireless Communications, Networking and Mobile Computing, 2008. WiCOM'08. 4th International Conference on.
- Chen, H., and Zhu, Y. (2008). *RFID networks planning using evolutionary algorithms and swarm intelligence*.

- Chen, H., Zhu, Y., and Hu, K. (2010). Multi-colony bacteria foraging optimization with cell-to-cell communication for RFID network planning. [doi: 10.1016/j.asoc.2009.08.023]. *Applied Soft Computing*, 10(2), 539-547.
- Chen, H., Zhu, Y., Hu, K., and Ku, T. (2011). RFID network planning using a multi-swarm optimizer. [doi: 10.1016/j.jnca.2010.04.004]. *Journal of Network and Computer Applications*, 34(3), 888-901.
- Chiu, S. (2010). Design of Passive Tag RFID Readers. In M. Bolic, d. Simplot-Ryl & I. Stojmenovic (Eds.), *RFID Systems: Research Trends and Challenges* (pp. 129-153). United Kingdom: Intel Corporation.
- Clarke, R. H., Twede, D., Tazelaar, J. R., and Boyer, K. K. (2006). Radio frequency identification (RFID) performance: the effect of tag orientation and package contents. *Packaging Technology and Science*, 19(1), 45-54.
- Clerc, M. (2006). *Particle swarm optimization* (Vol. 67).
- Clerc, M. (2009). A method to improve standard PSO.
- Clerc, M. (2010). *Particle swarm optimization* (Vol. 93): John Wiley & Sons.
- Corre, Y., and Lostanlen, Y. (2009). Three-Dimensional Urban EM Wave Propagation Model for Radio Network Planning and Optimization Over Large Areas. *Vehicular Technology, IEEE Transactions on*, 58(7), 3112-3123.
- Delen, D., Sharda, R., and Hardgrave, B. C. (2011). The promise of RFID-based sensors in the perishables supply chain. *Wireless Communications, IEEE*, 18(2), 82-88.
- Di Giampaolo, E., Forni, F., and Marrocco, G. (2010, 12-16 April 2010). *RFID-network planning by Particle Swarm Optimization*. Paper presented at the Antennas and Propagation (EuCAP), 2010 Proceedings of the Fourth European Conference on.
- Dingyi, Z., Yunlong, Z., and HanNing, C. (2008, 12-14 Oct. 2008). *An Algorithm for Deployment of RFID Readers in EPC Network*. Paper presented at the Wireless Communications, Networking and Mobile Computing, 2008. WiCOM '08. 4th International Conference on.
- Dixit, S. S., Gujar, U., and Kharde, R. (2012). Optimization of Heat Treatments for Wear Analysis of D5 Tool Steel by Using DOE/RSM. *Optimization*, 5(3), 19-28.

- Dobkin, D. (2008). The RF in RFID passive UHF in practice. *United States of America, Newness.*
- Dobkin, D. M. (2008). *The RF in RFID: passive UHF RFID in practice*: Newnes.
- Dobslaw, F. (2010). *A parameter tuning framework for metaheuristics based on design of experiments and artificial neural networks*. Paper presented at the Proceeding of the International Conference on Computer Mathematics and Natural Computing 2010.
- Eberhart, R. C., and Shi, Y. (2001). *Tracking and optimizing dynamic systems with particle swarms*. Paper presented at the Evolutionary Computation, 2001. Proceedings of the 2001 Congress on.
- Eberhart, R. C., Shi, Y., and Kennedy, J. (2001). *Swarm intelligence*: Elsevier.
- El-Gallad, A., El-Hawary, M., Sallam, A., and Kalas, A. (2002). *Enhancing the particle swarm optimizer via proper parameters selection*. Paper presented at the Electrical and Computer Engineering, 2002. IEEE CCECE 2002. Canadian Conference on.
- Elayoubi, S.-E., Ben Haddada, O., and Fourestié, B. (2008). Performance evaluation of frequency planning schemes in OFDMA-based networks. *Wireless Communications, IEEE Transactions on*, 7(5), 1623-1633.
- Elkamchouchi, H. M., Elragal, H. M., and Makar, M. A. (2007, 13-15 March 2007). *Cellular Radio Network Planning using Particle Swarm Optimization*. Paper presented at the Radio Science Conference, 2007. NRSC 2007. National.
- Elshayeb, S. A., Hasnan, K. B., and Yen, C. Y. (2009). Improving Supply Chain Traceability Using RFID Technology *International Conference on Recent and Emerging Advanced Technologies in Engineering 2009*.
- Engels, D. W., and Sarma, S. E. (2002). *The reader collision problem*. Paper presented at the Systems, Man and Cybernetics, 2002 IEEE International Conference on.
- Evers, G. I. (2009). *An automatic regrouping mechanism to deal with stagnation in particle swarm optimization*. University of Texas-Pan American.
- Fagui, L., and Zhaowei, M. (2006). *The Application of RFID Technology in Production Control in the Discrete Manufacturing Industry*. Paper presented at the Video and Signal Based Surveillance, 2006. AVSS '06. IEEE International Conference on.

- Fan, Z., Qiao, S., Huang-Fu, J. T., and Ran, L. X. (2007). Signal descriptions and formulations for long range UHF RFID readers. *Progress In Electromagnetics Research*, 71, 109-127.
- Fasbender, A., Reichert, F., Geulen, E., Hjelm, J., and Wierlemann, T. (1999). Any network, any terminal, anywhere [cellular radio]. *Personal Communications, IEEE*, 6(2), 22-30.
- Finkenzeller, K. (2010). *RFID handbook: fundamentals and applications in contactless smart cards, radio frequency identification and near-field communication*: Wiley.
- Franceschini, G., and Macchietto, S. (2008). Model-based design of experiments for parameter precision: State of the art. *Chemical Engineering Science*, 63(19), 4846-4872.
- Fred, N., Richard, G. M., Roger, M., and Ik-Whan, K. (2007). Examining RFID applications in supply chain management. *Commun. ACM*, 50(7), 92-101.
- Fuhrer, P., Guinard, D., and Liechti, O. (2006). RFID: From Concepts to Concrete Implementation.
- Gamst, A. (1987, 1-3 June 1987). *Remarks on radio network planning*. Paper presented at the Vehicular Technology Conference, 1987. 37th IEEE.
- Ghomsheh, V. S., Shoorehdeli, M. A., and Teshnehlab, M. (2007). *Training ANFIS structure with modified PSO algorithm*. Paper presented at the Control & Automation, 2007. MED'07. Mediterranean Conference on.
- Glover, B., and Bhatt, H. (2006). *RFID Essentials* (First Edition ed.). CA: O'Reilly Media, Inc.
- Gong, Y.-J., Shen, M., Zhang, J., Kaynak, O., Chen, W.-N., and Zhan, Z.-H. (2012). Optimizing RFID network planning by using a particle swarm optimization algorithm with redundant reader elimination. *Industrial Informatics, IEEE Transactions on*, 8(4), 900-912.
- Gong, Y., Shen, M., Zhang, J., Chen, W., and Zhan, Z. (2011). Optimizing RFID Network Planning by Using a Particle Swarm Optimization Algorithm with Redundant Reader Elimination.
- Guan, Q., Liu, Y., Yang, Y., and Yu, W. (2006). *Genetic approach for network planning in the RFID systems*. Paper presented at the Intelligent Systems Design and Applications, 2006. ISDA'06. Sixth International Conference on.

- Hämäläinen, J. (2008a). Cellular network planning and optimization—part VII: WCDMA link budget. *Helsinki University of Technology*.
- Hämäläinen, J. (2008b). Cellular Network Planning and Optimization Part I: Introduction.
- Han, F., and Jie, Q. (2012, 19-22 Feb. 2012). *Optimal RFID networks planning using a hybrid evolutionary algorithm and swarm intelligence with multi-community population structure*. Paper presented at the Advanced Communication Technology (ICACT), 2012 14th International Conference on.
- Har, D., Watson, A. M., and Chadney, A. G. (1999). Comment on diffraction loss of rooftop-to-street in COST 231-Walfisch-Ikegami model. *Vehicular Technology, IEEE Transactions on*, 48(5), 1451-1452.
- Hasnan, K., Bareduan, S. A., Nawawi, A., and Sidek, N. A. (2013). *Implementation of RFID System for Improving the Inventory Management System in Unijoh Sdn. Bhd.* Paper presented at the 1st National Conference on Knowledge Transfer (KTP 01).
- Hinkelmann, K., and Kempthorne, O. (2008). Design and analysis of experiments: Volume 1: Introduction to experimental design. *AMC*, 10, 12.
- Huseynov, F., and Yıldırım, S. Ö. (2014). Internet users' attitudes toward business-to-consumer online shopping A survey. *Information Development*, 0266666914554812.
- Jones, E. C., and Chung, C. A. (2007). *RFID in logistics: a practical introduction*: CRC.
- Karmakar, N. C. (2010). *Handbook of smart antennas for RFID systems*: Wiley Online Library.
- Kennedy, J., and Eberhart, R. (1995, Nov/Dec 1995). *Particle swarm optimization*. Paper presented at the Neural Networks, 1995. Proceedings., IEEE International Conference on.
- Kennedy, J., and Eberhart, R. C. (1997). *A discrete binary version of the particle swarm algorithm*. Paper presented at the Systems, Man, and Cybernetics, 1997. Computational Cybernetics and Simulation., 1997 IEEE International Conference on.



- Khalilzadeh, M., Kianfar, F., Shirzadeh Chaleshtari, A., Shadrokh, S., and Ranjbar, M. (2012). A Modified PSO Algorithm for Minimizing the Total Costs of Resources in MRCPS. *Mathematical Problems in Engineering*, 2012.
- Khare, A., and Rangnekar, S. (2012). Particle Swarm Optimization: A Review. *Applied Soft Computing*.
- Kim, D. Y., Yoon, H. G., Jang, B. J., and Yook, J. G. (2008). Interference analysis of UHF RFID systems. *Progress In Electromagnetics Research*, 4, 115-126.
- Knight, A. (1999). *Basics of MATLAB and Beyond*: Chapman & Hall/CRC.
- Kramer, O., Gloger, B., and Goebels, A. (2007). *An experimental analysis of evolution strategies and particle swarm optimisers using design of experiments*. Paper presented at the Proceedings of the 9th annual conference on Genetic and evolutionary computation.
- Kuncicky, D. C. (2003). MATLAB programming. *Recherche*, 67, 02.
- Laiho-Steffens, J., Wacker, A., and Aikio, P. (2000, 2000). *The impact of the radio network planning and site configuration on the WCDMA network capacity and quality of service*. Paper presented at the Vehicular Technology Conference Proceedings, 2000. VTC 2000-Spring Tokyo. 2000 IEEE 51st.
- Laiho, J., and Wacker, A. (2001). *Radio network planning process and methods for WCDMA*. Paper presented at the Annales des télécommunications.
- Laiho, J., Wacker, A., and Novosad, T. (2006). *Radio network planning and optimisation for UMTS*: John Wiley & Sons.
- LASP, L. f. A. a. S. P. The Electromagnetic Spectrum. University of Colorado: Laboratory for Atmospheric and Space Physics (LASP).
- Lehpamer, H. (2007). *RFID design principles*: Artech House, Inc.
- Lehpamer, H. (2012). *RFID design principles*: Artech House.
- Leong, K. S., Ng, M. L., and Cole, P. H. (2005). *The reader collision problem in RFID systems*. Paper presented at the Microwave, Antenna, Propagation and EMC Technologies for Wireless Communications, 2005. MAPE 2005. IEEE International Symposium on.
- Leong, K. S., Ng, M. L., and Cole, P. H. (2006). *Positioning analysis of multiple antennas in a dense RFID reader environment*.
- Levis, C., Johnson, J. T., and Teixeira, F. L. (2010). *Radiowave propagation: physics and applications*: John Wiley & Sons.

- Li-Ping, Z., Huan-Jun, Y., and Shang-Xu, H. (2005). Optimal choice of parameters for particle swarm optimization. *Journal of Zhejiang University Science A*, 6(6), 528-534.
- Lin, C. F., and Lin, F. Y. S. (2007). *A simulated annealing algorithm for RFID reader networks*.
- Liu, H., Gao, L., and Pan, Q. (2011). A hybrid particle swarm optimization with estimation of distribution algorithm for solving permutation flowshop scheduling problem. *Expert Systems with Applications*, 38(4), 4348-4360.
- Lozano-Nieto, A. (2010). RFID design fundamentals and applications. *Recherche*, 67, 02.
- Lozano-Nieto, A. (2011). *RFID design fundamentals and applications*: CRC press.
- Luke, S. (2012). *Essentials of Metaheuristics* (First Edition (Rev C) ed.): George Mason University.
- Malviya, S., and Sawant, C. (2014). Perception of Youth Towards Online Shopping. *Sawant, Chetna and Malviya, S., " Perception of Youth towards online shopping", Altius Shodh Journal of Management and Commerce*, 432-436.
- Mathews, P. G. (2005). *Design of Experiments with MINITAB*: ASQ Quality Press.
- Mehrjerdi, Y. Z. (2009). RFID-enabled supply chain systems with computer simulation. [Research paper]. *Assembly Automation*, 29(2), 174–183.
- Mei-Ping, S., and Guo-Chang, G. (2004, 26-29 Aug. 2004). *Research on particle swarm optimization: a review*. Paper presented at the Machine Learning and Cybernetics, 2004. Proceedings of 2004 International Conference on.
- Miles, S. B., Sarma, S. E., and Williams, J. R. (2008). *RFID technology and applications* (Vol. 1): Cambridge University Press Cambridge.
- Mirza, S. M. (2010). Introduction to Matlab®. *Beginner Resource*.
- Mishra, A. R. (2004). *Fundamentals of cellular network planning and optimisation: 2G/2.5 G/3G... evolution to 4G*: John Wiley & Sons.
- Moore, D. S., McCabe, G. P., and Evans, M. J. (2005). *Introduction to the practice of statistics minitab manual and minitab version 14*: WH Freeman & Co.
- Nath, B., Reynolds, F., and Want, R. (2006). RFID technology and applications. *Pervasive Computing, IEEE*, 5(1), 22-24.
- Nawawi, A., Hasnan, K., and Ahmad Bareduan, S. (2011). The application of RFID technology to capture and record product and process data for reverse logistics sorting activity.

- Nawawi, A., Hasnan, K., and Ahmad Bareduan, S. (2014). Correlation between RFID Network Planning (RNP) Parameters and Particle Swarm Optimization (PSO) Solutions. *Applied Mechanics and Materials*, 465, 1245-1249.
- Nedjah, N., and de Macedo Mourelle, L. (2006). *Swarm intelligent systems* (Vol. 26): Springer.
- Niu, B., Zhu, Y., He, X., and Wu, H. (2007). MCPSO: A multi-swarm cooperative particle swarm optimizer. *Applied Mathematics and Computation*, 185(2), 1050-1062.
- Nuza, S. S., and Mazrekaj, A. Z. (2012). Link budget analysis in the network designed mobile WiMAX technology in the territory of the urban area of the city of Gjakova. *IJCSI International Journal of Computer Science Issues*, 9(5).
- Oztekin, A., Pajouh, F. M., Delen, D., and Swim, L. K. (2010). An RFID network design methodology for asset tracking in healthcare. *Decision Support Systems*, 49(1), 100-109.
- Packianather, M., Chan, F., Griffiths, C., Dimov, S., and Pham, D. (2013). Optimisation of Micro Injection Moulding Process through Design of Experiments. *Procedia CIRP*, 12, 300-305.
- Paret, D. (2010). *RFID at ultra and super high frequencies: theory and application*: Wiley.
- Parsopoulos, K. E., and Vrahatis, M. N. (2002). Recent approaches to global optimization problems through particle swarm optimization. *Natural computing*, 1(2), 235-306.
- Polycarpou, A. C., Dimitriou, A., Bletsas, A., Polycarpou, P. C., Papaloizou, L., Gregoriou, G., *et al.* (2012). On the design, installation, and evaluation of a radio-frequency identification system for healthcare applications [wireless corner]. *Antennas and Propagation Magazine, IEEE*, 54(4), 255-271.
- Poole, O. (1998). Basic radio: principles and technology (paper).
- Practel, I. (2004). *RFID Report: A New Horizon for Accountable Society* (No. 1568511817, 9781568511818).
- Priya, T. S. (2010). Optimised COST-231 Hata models for WiMAX path loss prediction in suburban and open urban environments. *Modern Applied Science*, 4(9), P75.



- Qiang, G., Yu, L., Yiping, Y., and Wensheng, Y. (2006, 16-18 Oct. 2006). *Genetic Approach for Network Planning in the RFID Systems*. Paper presented at the Intelligent Systems Design and Applications, 2006. ISDA '06. Sixth International Conference on.
- Rahman, U., Matin, M., and Rahman, M. (2013). A practical approach of planning and optimization for efficient usage of GSM network. *International Journal of Communications, 1*.
- Raji, A. W. M., Rahmat, H., Kamis, I., Talib, M. M., Mohamad, M. N., and Tiong, O. C. (2002). Geometri Koordinat Lanjutan. In M. Z. Bahak (Ed.), *Matematik Lanjutan* (pp. 92-133). Johor Bahru: Universiti Teknologi Malaysia.
- Ren, Z., Anumba, C. J., and Tah, J. (2011). RFID-facilitated construction materials management (RFID-CMM)–A case study of water-supply project. *Advanced Engineering Informatics, 25*(2), 198-207.
- Ren, Z., Anumba, C. J., and Tah, J. (2011). RFID-facilitated construction materials management (RFID-CMM) – A case study of water-supply project. *Advanced Engineering Informatics, 25*(2), 198-207.
- Riaz, M., Imran, M. A., and Hoshyar, R. (2010, 19-22 Sept. 2010). *Frequency planning of clustered cellular network using Particle Swarm Optimization*. Paper presented at the Wireless Communication Systems (ISWCS), 2010 7th International Symposium on.
- Rozal, E. O., and Pelaes, E. G. (2007, Oct. 29 2007-Nov. 1 2007). *Statistical adjustment of Walfisch-Ikegami model based in urban propagation measurements*. Paper presented at the Microwave and Optoelectronics Conference, 2007. IMOC 2007. SBMO/IEEE MTT-S International.
- Sahin, E., Dallery, Y., and Gershwin, S. (2002, 6-9 Oct. 2002). *Performance evaluation of a traceability system. An application to the radio frequency identification technology*. Paper presented at the Systems, Man and Cybernetics, 2002 IEEE International Conference on.
- Sarma, S. (2004). Integrating rfid. *Queue, 2*(7), 50-57.
- Scholar, G. (2014). Publications related to Particle Swarm Optimization (PSO). Retrieved 30th April, 2014, 2014, from [http://scholar.google.com/scholar?q=%22particle+swarm+optimization%22&hl=en&as\\_sdt=0%2C5&as\\_ylo=2013&as\\_yhi=2013](http://scholar.google.com/scholar?q=%22particle+swarm+optimization%22&hl=en&as_sdt=0%2C5&as_ylo=2013&as_yhi=2013)

- Shi, Y., and Eberhart, R. (1998). *A modified particle swarm optimizer*. Paper presented at the Evolutionary Computation Proceedings, 1998. IEEE World Congress on Computational Intelligence., The 1998 IEEE International Conference on.
- Shi, Y., and Eberhart, R. (1998). *Parameter selection in particle swarm optimization*. Paper presented at the Evolutionary Programming VII.
- Siemens. (2012). RFID System for The UHF Frequency Range. In S. AG (Ed.) (pp. 42): Siemens AG.
- Song, L., and Shen, J. (2010). *Evolved cellular network planning and optimization for UMTS and LTE*: CRC Press.
- Song, M.-P., and Gu, G.-C. (2004). *Research on particle swarm optimization: a review*. Paper presented at the Machine Learning and Cybernetics, 2004. Proceedings of 2004 International Conference on.
- Suriya, A., and Porter, J. D. (2013). *An RFID Network Modeling and Optimization using Particle Swarm Optimization*. Paper presented at the Proceedings of EECON 2013.
- Sweeney, P. J. (2005). *RFID for Dummies*: For Dummies.
- Tamizharasan, T., Barnabas, J. K., and Ahamed, J. F. A. (2002). Optimization of parameters in hard dry turning using DoE, DE and PSO. *Journal of Mechanical Science*.
- Tao, C., Yongsheng, Y., and Bin, Y. (2011, 26-27 Aug. 2011). *RFID Dense Reader Network Anti-collision PSO Model and Solving*. Paper presented at the Intelligent Human-Machine Systems and Cybernetics (IHMSC), 2011 International Conference on.
- Tao, Y., and Wu, Y. (2011). A Model of Real-Time Supply Chain Collaboration under RFID Circumstances. *Advances in Computer Science, Environment, Ecoinformatics, and Education*, 545-551.
- Ting, S., Kwok, S. K., Tsang, A. H., and Lee, W. (2011). Critical elements and lessons learnt from the implementation of an RFID-enabled healthcare management system in a medical organization. *Journal of medical systems*, 35(4), 657-669.
- Türke, U., Perera, R., Lamers, E., Winter, T., and Görg, C. (2003). An advanced approach for QoS analysis in UMTS radio network planning. In R. L. J.

- Charzinski & P. Tran-Gia (Eds.), *Teletraffic Science and Engineering* (Vol. Volume 5, pp. 91-100): Elsevier.
- Tutschku, K. (1998, 29 Mar-2 Apr 1998). *Demand-based radio network planning of cellular mobile communication systems*. Paper presented at the INFOCOM '98. Seventeenth Annual Joint Conference of the IEEE Computer and Communications Societies. Proceedings. IEEE.
- Van Den Bergh, F. (2002). An analysis of particle swarm optimizers.
- Van Den Bergh, F. (2006). *An analysis of particle swarm optimizers*. University of Pretoria.
- Van den Bergh, F., and Engelbrecht, A. (2006). A study of particle swarm optimization particle trajectories. *Information Sciences*, 176(8), 937-971.
- Venkataraman, P. (2009). *Applied Optimization with MATLAB Programming* (Second Edition ed.). New Jersey: John Wiley & Sons, Inc.
- Wacker, A., Laiho-Steffens, J., Sipila, K., and Heiska, K. (1999). *The impact of the base station sectorisation on WCDMA radio network performance*. Paper presented at the Vehicular Technology Conference, 1999. VTC 1999-Fall. IEEE VTS 50th.
- Wacker, A., Laiho-Steffens, J., Sipila, K., and Jasberg, M. (1999, Jul 1999). *Static simulator for studying WCDMA radio network planning issues*. Paper presented at the Vehicular Technology Conference, 1999 IEEE 49th.
- Wallace, M., and Walton, R. (1994, 27 Sep-1 Oct 1994). *CDMA radio network planning*. Paper presented at the Universal Personal Communications, 1994. Record., 1994 Third Annual International Conference on.
- Wang, F., and Liu, P. (2005a). *Temporal Management of RFID Data*. Paper presented at the 31st VLDB Conference, Trondheim, Norway.
- Wang, F., and Liu, P. (2005b). *Temporal management of RFID data*. Paper presented at the Proceedings of the 31st international conference on Very large data bases.
- Wang, G., Zhao, G., Li, H., and Guan, Y. (2011a). Multi-objective optimization design of the heating/cooling channels of the steam-heating rapid thermal response mold using particle swarm optimization. *International Journal of Thermal Sciences*, 50(5), 790-802.
- Wang, G., Zhao, G., Li, H., and Guan, Y. (2011b). Research on optimization design of the heating/cooling channels for rapid heat cycle molding based on

- response surface methodology and constrained particle swarm optimization. *Expert Systems with Applications*, 38(6), 6705-6719.
- Wang, L.-C., Stuber, G. L., and Lea, C.-T. (1997). Architecture design, frequency planning, and performance analysis for a microcell/macrocell overlaying system. *Vehicular Technology, IEEE Transactions on*, 46(4), 836-848.
- Wang, S.-W., and Wang, I. (1993). *Effects of soft handoff, frequency reuse and non-ideal antenna sectorization on CDMA system capacity*. Paper presented at the Vehicular Technology Conference, 1993., 43rd IEEE.
- Want, R. (2006). An introduction to RFID technology. *Pervasive Computing, IEEE*, 5(1), 25-33.
- Wille, V., and King, A. (1998, 23 Feb 1998). *Microcellular planning based on information from the radio network*. Paper presented at the Antennas and Propagation for Future Mobile Communications (Ref. No. 1998/219), IEE Colloquium on.
- Xin-min, Z., Qun-kui, Y., and Jing, L. (2011, 3-5 Sept. 2011). *The planning of workshop RFID network based on modified genetic algorithm using metropolis rule*. Paper presented at the Industrial Engineering and Engineering Management (IE&EM), 2011 IEEE 18Th International Conference on.
- Yahui, Y., Yujie, W., Min, X., and Zhijing, Q. (2009, 25-26 April 2009). *A RFID Network Planning Method Based on Genetic Algorithm*. Paper presented at the Networks Security, Wireless Communications and Trusted Computing, 2009. NSWCTC '09. International Conference on.
- Ying, G., Xiao, H., Huiliang, L., and Yuanyong, F. (2010, 13-14 March 2010). *Multiobjective Estimation of Distribution Algorithm Combined with PSO for RFID Network Optimization*. Paper presented at the Measuring Technology and Mechatronics Automation (ICMTMA), 2010 International Conference on.